



UNIVERSITI PUTRA MALAYSIA

***RISK MANAGEMENT IN AGRICULTURE THROUGH INFORMATION AND
COMMUNICATION TECHNOLOGIES IN SELECTED STATES OF
MALAYSIA***

MUHAMMAD ALI

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AND COMMUNICATION TECHNOLOGIES IN SELECTED STATES OF
MALAYSIA**

By

MUHAMMAD ALI

**Thesis Submitted to the School of Graduate Studies, Universiti Putra Malaysia,
in Fulfillment of the Requirements for the Degree of Doctor of Philosophy**

January 2018

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DEDICATION

TO

MY GREAT MOTHER, WIFE, AYYAN AND ALL FAMILY

&

ALSO DEDICATED

TO

DR. KRISTIN E. DAVIS (IFPRI/GFRAS)



Abstract of thesis presented to the Senate of Universiti Putra Malaysia in fulfillment of the requirement for the degree of Doctor of Philosophy

RISK MANAGEMENT IN AGRICULTURE THROUGH INFORMATION AND COMMUNICATION TECHNOLOGIES IN SELECTED STATES OF MALAYSIA

By

MUHAMMAD ALI

January 2018

Chairman : Associate Professor Norsida Man, PhD
Faculty : Agriculture

Agricultural risk management is getting priority by the farmers to overcome problems prevailing due to climatic variations and affecting farms and farmers' behavioral intention to use ICTs for managing agriculture related risks. As ICTs have proved cheap, speedy, easy to operate in sharing, learning various practices for managing risks at individual and collective level, so, existing condition of ICT usage alongwith risk management techniques were deemed necessary to examine at various parts of the country. Agriculture extension services in this context were also required to determine at the field level.

Therefore, the prime focus of this study was to examine management of risk in agriculture through Information and Communication Technologies at selected states in Malaysia. The empirical research was conducted: 1) to identify the ICT technologies, sources of information use, agriculture extension services, existing networks and adaptation by the respondents in managing agriculture risk; 2) to examine attitude level, subjective norm level, perceived behavioral control level and intention level to use ICTs for agricultural risk management; 3) to evaluate the relationship between socio-demographic factors and intention to use ICTs for managing agricultural risks by the respondents; 4) to assess relationship between attitude, subjective norm, perceived behavioral control and intention to use ICTs for agricultural risk management; and 5) to determine the influence of attitude, subjective norms, perceived behavioral control (IVs) on the intention (DV) of farmers to use ICTs for risk management in agriculture.

The data were collected through survey method in which pre designed questionnaire was used as research instrument. Multistage cluster sampling technique was used to gather data from total 360 farmers. The data were randomly collected from three states which were reflecting East zone (Pahang and Terengganu), South zone (Johor) and North zone (Kedah). The statistical analysis techniques administered in this study were descriptive analysis, chi square, Pearson correlation and multiple regression.

The results showed that mobile was used by majority of farmers. Additionally, the results of chi square revealed that education, dependent size, land ownership and income had significant association ($p < 0.05$) with intention of farmers. The result of bivariate correlation matrix revealed that there was statistically significant plus positive relationship between attitude ($r = 0.705$), subjective norms ($r = 0.551$), perceived behavioral control ($r = 0.642$) and intention at 0.01 level with $p = 0.0001$. The results of regression analysis depicted that there is high relationship ($R = 0.730$) between IVs and intention to use ICTs for agricultural risk management. Moreover, about 53% (adj. R^2) variance in intention to use ICTs is explained by IVs.

In conclusion, farmers' intention to use ICTs for agricultural risk management was influenced by attitude, social pressure and personal control. Additionally, extension services providers need to pay more attention towards farmers to integrate digital technologies in order to get equipped in advance for any kind of disasters. The study recommends that capacity building programmes should be initiated to use ICTs for agricultural risk management for the extension field staff and farmers.

Abstrak tesis yang dikemukakan kepada Senat Universiti Putra Malaysia sebagai memenuhi keperluan untuk ijazah Doktor Falsafah

**PENGURUSAN RISIKO DALAM PERTANIAN MELALUI TEKNOLOGI
MAKLUMAT DAN KOMUNIKASI BAGI NEGERI TERPILIH DI
MALAYSIA**

Oleh

MUHAMMAD ALI

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Pengurusan risiko pertanian kini mendapat keutamaan daripada petani bagi mengatasi masalah yang wujud disebabkan variasi cuaca dan ini menjejaskan ladang serta niat dan tingkah laku petani untuk menggunakan ICT bagi menguruskan risiko berkaitan dengan pertanian. Memandangkan ICT terbukti murah, pantas, mudah untuk dikendalikan dan sememangnya efektif dalam perkongsian, pembelajaran pelbagai amalan untuk menguruskan risiko pada peringkat individu dan kolektif, maka tahap penggunaan ICT sedia ada di samping teknik pengurusan risiko perlu diuji di pelbagai bahagian negara ini. Perkhidmatan pengembangan pertanian dalam konteks ini juga diperlukan bagi menentukan penggunaan ICT pada peringkat lapangan.

Oleh itu, fokus utama kajian ini adalah untuk meneliti pengurusan risiko dalam pertanian melalui penggunaan Teknologi Maklumat dan Komunikasi di beberapa negeri terpilih di Malaysia. Penyelidikan empirikal telah dijalankan: 1) untuk mengenal pasti teknologi maklumat dan komunikasi (ICT), sumber penggunaan maklumat, perkhidmatan pengembangan pertanian, jaringan sedia ada dan adaptasi oleh responden dalam menguruskan risiko pertanian; 2) untuk meneliti tahap sikap, tahap norma subjektif, tahap kawalan tingkah laku terjangka dan tahap niat untuk menggunakan ICT bagi pengurusan risiko pertanian; 3) untuk menilai hubungan antara faktor sosiodemografik dan tahap niat untuk menggunakan ICT bagi menguruskan risiko pertanian oleh responden; 4) untuk menaksir hubungan antara sikap, norma subjektif, kawalan tingkah laku terjangka dan niat untuk menggunakan ICT untuk pengurusan risiko pertanian; dan 5) untuk meneliti pengaruh sikap, norma subjektif, kawalan tingkah laku terjangka (IV) ke atas niat (DV) petani untuk menggunakan ICT untuk pengurusan risiko dalam pertanian.

Data telah dikumpul melalui kaedah tinjauan yang menggunakan soal selidik prereka bentuk sebagai instrumen penyelidikan. Teknik persampelan kluster pelbagai peringkat telah digunakan untuk mengumpul data daripada sejumlah 360 orang petani. Data telah dikumpul dari zon Timur (Pahang dan Terengganu), zon Selatan (Johor) dan zon Utara (Kedah). Teknik analisis statistik yang digunakan dalam kajian ini ialah analisis deskriptif, khi kuasa dua, korelasi Pearson dan regresi berganda.

Dapatan kajian menunjukkan bahawa telefon bimbit digunakan oleh majoriti petani. Tambahan pula, keputusan khi kuasa dua menunjukkan bahawa pendidikan, saiz dependen, pemilikan tanah dan pendapatan mempunyai perkaitan yang signifikan ($p < 0.05$) dengan niat petani. Keputusan matrik korelasi bivariat memperlihatkan bahawa terdapat kesignifikan secara statistik beserta hubungan positif antara sikap ($r = 0.705$), norma subjektif ($r = 0.551$), kawalan tingkah laku terjangka ($r = 0.642$) dan niat pada tahap 0.01 dengan $p = 0.0001$. Keputusan analisis regresi memperlihatkan bahawa terdapat hubungan yang tinggi ($R = 0.730$) antara IV dan niat untuk menggunakan ICT untuk pengurusan risiko pertanian. Tambahan pula, lebih kurang 53% (adj. R^2) varians dalam niat untuk menggunakan ICT telah diperjelaskan oleh IV.

Kesimpulannya, niat petani untuk menggunakan ICT untuk pengurusan risiko pertanian telah dipengaruhi oleh sikap, tekanan sosial dan kawalan personal. Tambahan lagi, penyedia perkhidmatan pengembangan perlu memberikan perhatian yang lebih kepada petani untuk mengintegrasikan teknologi digital supaya dilengkapi terlebih dahulu untuk sebarang jenis bencana. Kajian ini mencadangkan agar program pembangunan kapasiti perlu dilaksanakan kepada pegawai perkhidmatan pengembangan dan para petani untuk menggunakan ICT dalam menguruskan risiko pertanian.

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I certify that a Thesis Examination Committee has met on 18 January 2018 to conduct the final examination of Muhammad Ali on his thesis entitled "Risk Management in Agriculture through Information and Communication Technologies in Selected States of Malaysia" in accordance with the Universities and University Colleges Act 1971 and the Constitution of the Universiti Putra Malaysia [P.U.(A) 106] 15 March 1998. The Committee recommends that the student be awarded the Doctor of Philosophy.

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LIST OF ABBREVIATIONS

ARM	Agricultural Risk Management
DoA	Department of Agriculture
DoI	Diffusion of Innovation
EAS	Extension Advisory Service
EFS	Extension Field Staff
FAMA	Federal Agriculture Marketing Authority
FAO	Food and Agriculture Organization
FOA	Farmers Organization Authority
GDP	Gross Domestic Product
GSIAC	Global Science and Innovation Advisory Council
IT	Information Technology
ICT	Information and Communication Technology
IFAD	International Fund for Agriculture Development
IPCC	Intergovernmental Panel on Climate Change
JKKK	<i>Jawatankuasa Kemajuan dan Keselamatan Kampung</i>
LKIM	Malaysia Fisheries Development Board
MARDI	Malaysian Agriculture Research and Development Institute
MCMC	Malaysian Communication and Multimedia Commission
MPOB	Malaysia Palm Oil Board
NDMA	National Disaster Management Authority
NGOs	Non Governmental Organizations
PBC	Perceived Behavioral Control

R&D	Research and Development
RISDA	Rubber Industry Smallholder Development Authority
SPM	<i>Sijil Pelajaran Malaysia</i>
SPMV	<i>Sijil Pelajaran Malaysia Vokasional</i>
SPSS	Statistical Package for Social Science
TMP	Tenth Malaysia Plan
TPB	Theory of Planned Behavior
TRA	Theory of Resasond Action
UTAUT	Unified Theory of Acceptance and Use of Technology

CHAPTER 1

INTRODUCTION

1.1 Introduction

This chapter explains the background of the study, overview of Malaysia and its agriculture, national agriculture policy on food security, climate change scenario in Malaysia, risk management and ICTs, role of agriculture agencies in agriculture and ICT usage, future vision on the usage of risk management and ICTs, problem statement, research questions, objectives of the study, significance of the study, conceptual and operational definitions of terms and thesis organization.

1.2 Background of the Study

Agricultural extension services are aimed to educate, facilitate in learning and expand knowledge and skills of farming community on various farming activities and change their attitude as favorable about innovations in agriculture (Baig and Aldosari, 2013). Through extension education, farmers are being helped to increase production and cultivation techniques, improve agricultural activities, income, livelihood and ultimately accelerate their socio-economic and standards of education (Anderson and Feder, 2004; Van den Ban and Hawkins, 1996; Antholt, 1991). According to Tiraieyari and Uli (2011), the effectiveness of extension education is rely on extension agents' ability to transfer sustainable practices to farming community who can play pivotal role in the context of Malaysia. Therefore, extension agents in Malaysia are expected to transform farmers' lives through paying regular visits, supporting through linkages development and organizing farmers, updating their knowledge, skills, attitude and behavioral intentions to use ICTs for agricultural development.

Agriculture is equally important for Malaysia as other development sectors. Multiculturalism as a distinct feature of Malaysia also mirrors in the versatile farming and farmers, as the farming community is attached to this sector since ages. All the farmers in the country are not facing same problems because it depends on the location and available resources (Alam *et al.*, 2012). Certain areas are prone to natural disasters which have been devastating plenty of national and individual resources in many forms. The current century has given variety of digital technologies to solve the problems and make profits in almost all spheres of life. However, agriculture has not used fully the potential of so-called Information and Communication Technologies (ICTs) (Milovanovic, 2014).

Pickernell *et al.* (2004) stated that big impact of ICT usage on agriculture is certain as it has open windows of opportunities for farmers and ultimately improves their quality of life. Hassan *et al.* (2011) observed that ICTs are playing pivotal role in transformation of Malaysian rural community and achieving national vision 2020

through establishment of k-community (knowledgeable community). So, it seems that importance of ICTs cannot be ignored in agricultural sector of Malaysia.

The agriculture sector has proved to be one of drivers of economy in many developing countries, despite being faced with numerous obstacles mainly due to risk and uncertainty even in the current era of digital revolution. Agricultural sector is influenced by unexpected risks and often beyond control. These risks affect crops, prices of commodities, demand of consumer, source of pests and diseases and also adversely impact on economy, social fabric and psychology of the victims. Additionally, frequent floods and other major or minor natural tragedies have adversely affected farms, producers and are halting the development mechanism (Austin and Baharuddin, 2012). According to Legg and Huang (2010), approximately 14% of greenhouse gas emissions at global level is directly contributed by farm sector which is higher than transport and industry combined.

The term risk and uncertainty are being used invariably in various sectors and revealed unexpected events which lead to various forms of losses. The literal meaning of both terms are different. Like, risk is scanty of knowledge where the possible impacts are known whereas, uncertainty is when likelihoods are unknown. Agriculture system is faced by different kinds of risks on account of lack of awareness and probability of unexpected events which create hurdles in the agricultural development process. In order to further understand the issue, agriculture in Malaysia is presented in the next topic.

1.3 Agriculture in Malaysia

Malaysia is a country having tropical climate and fits into the Sunderland bio geographical area. It occupies about 33.27 million hectares of an area, with composition of Peninsular Malaysia, the states of Sabah and Sarawak in the eastern region and the Federal Territory of Labuan in the northwestern coastal area of Borneo Island as shown in Map 1.1. The South China Sea bifurcate the two regions which is approximately 540 kilometers. Malaysia lies completely in the equatorial zone and the average daily temperature throughout Malaysia varies from 21⁰C to 32⁰C. The multi-racial and ethnic population of Malaysia is estimated at 29.7 million in 2013 (Government of Malaysia, 2014).



Map 1.1 : Map of Malaysia
(Source : Google Maps)

Agriculture sector is still vibrant to Malaysia's economy. Agriculture contribution to the GDP of national economy is 8.1% (Department of Statistics Malaysia, 2017), which is comparatively low as compared to the year 2014 which was 11.2% with occupied labour force of 11.1% (CIA, 2014). Moreover, among the agriculture products in Figure 1.1, oil palm is the main contributor to agriculture sector GDP which is 43.1%. While in agriculture sector, the other contribution is made by livestock (11.6%) followed by fisheries (11.5%), rubber (7.1%) and forestry (7.2%) respectively (Department of Statistics Malaysia, 2017).

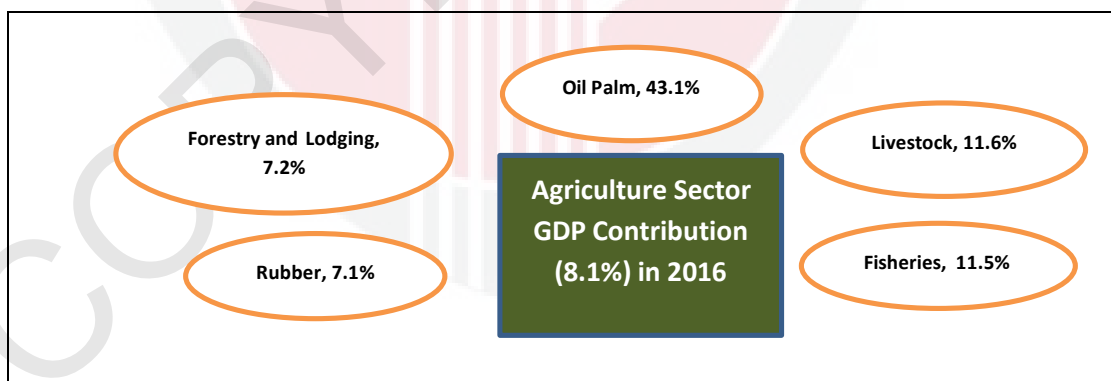


Figure 1.1 : Agriculture Sector GDP Contribution, 2016

(Source : Selected Agriculture indicators, Malaysia, Department of Statistics, Malaysia 2017)

Agriculture is not only the source of food but also provide jobs to the people who are directly or indirectly involved in this sector. It can be seen from the following Figure 1.2 that agriculture sector has provided employment to 1,609.9 thousands people

which is decreased by 8.2% as compared to last year. Additionally, agriculture sector has also absorbed 600.4 thousands non Malaysian people in 2016 with the 7.1 percent decreased from the year 2015. Furthermore, gender absorption in this sector shows that male with 70% is dominant as compared to female gender who are just 30% absorbed in the agriculture sector. Thus, agriculture sector is dominant by more than 70% male gender in the country.

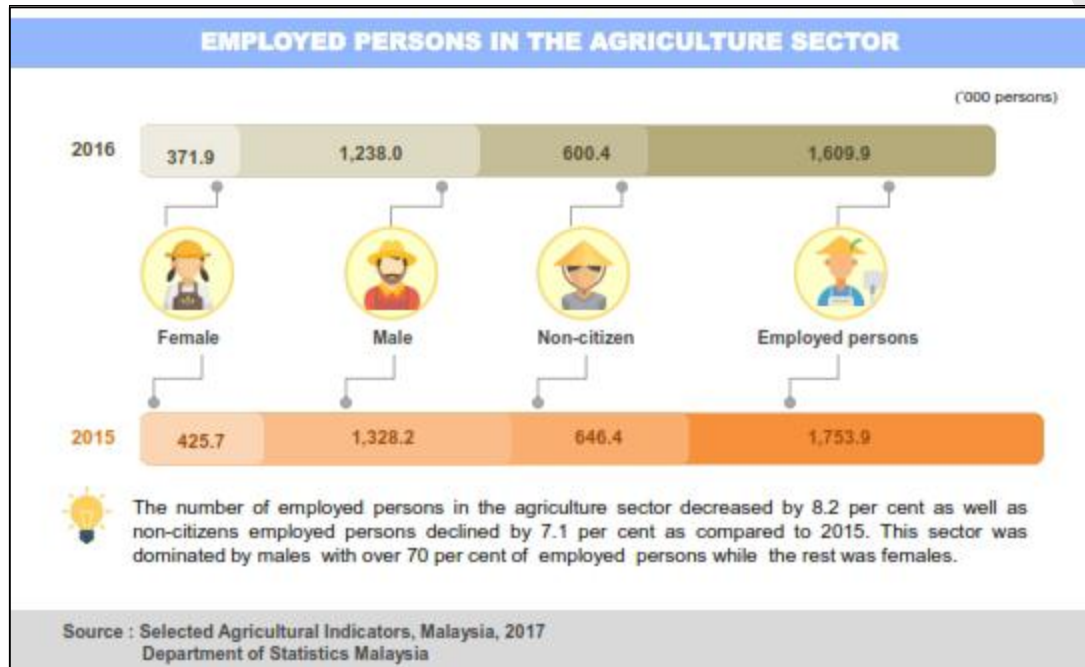


Figure 1.2 : Employment in the Agriculture Sector

(Source : Selected Agriculture indicators, Malaysia, Department of Statistics, Malaysia 2017)

Agriculture is still 3rd engine of economic growth. The 11th Malaysian Plan (2016-2020) with the theme “anchoring growth on people” aimed to become fully developed country and welfare state. The vision would transform people and boost economic growth. The efforts are being made to excel in the region and modernise agriculture sector which will ultimately improve the livelihood of farmers. Additionally, the modernisation of agriculture would be ensured by promotion of sustainable and advance technology adoption to ultimately generate high agricultural income. In the plan, various agriculture based initiatives have been mentioned such as promoting private sector investment to speed up economic growth alongwith diverting focus from imports to the export of commodities. This sector is forecasted to expand by 3.5% with 7.8% contribution in GDP annually by modernising agricultural sector (Government of Malaysia, 2015). Support to ICT adoption as modern technology is also an encouraging intervention for agriculture and other sectors. Additionally, a noteworthy focus is on climate change at the national level with one of the strategies to manage risk. On top of that, 11th plan also reflect institutional support and extension services strengthening including capacity building of extension service providers under

the domain of modernising agriculture. These all efforts would lead to increase income and productivity of farmers including small landholding farmers of the country.

It is expected that these efforts would burgeon the agriculture sector in right way and reduce poverty at large. It is one of the encouraging elements of the policy that ICT-based agriculture have got attention to expedite the agriculture development process by introducing innovation based technologies. After seeing agriculture situation in Malaysia, current scenario of food security with regard to ICT application is mentioned next as it is very important at the country level.

1.4 Current Scenario of Food Security and ICT Application

Jere and Maharaj (2017) stated that ICTs have potential in the context of agriculture as these can facilitate farm condition to generate more profit, increase crop production and enhance efficiency which ultimately reflect food security. Muriithi *et al.* (2009) also emphasized that ICTs have demonstrated potential in the frame of food security in African continent. Food security for sustainable agriculture and livelihood of small scale farmers has been stressed in Malaysia. Government of Malaysia is struggling to increase food production for ensuring self food sufficiency level and enhance export of food products (Tiraieyari and Uli, 2011). According to Singh and Grover (2013), ICTs role to ensure food security cannot be overlooked because this issue has been jeopardized by climate changes and there is a need to sensitize farmers through information provision.

Moon *et al.* (2016) stated in the context of Bangladesh that different actors are focusing on food security of the growing population and extension service providers are one of the important partners in this regard. Jan *et al.* (2008) also highlighted in the context of Pakistan that good farmer-extension linkages are vital to ensure food security of the population explosion. According to Ismail (2010), it is a crucial time when Malaysia dreams to achieve the status of advanced high income economy. As the population is growing rapidly and income level is also escalating, the policy is useful to secure food for dense population and less dependency on imported food items.

Policy is a living document and road map showing activities to follow and implement for achieving development targets. Malaysia is also one of those countries, which devise policies to achieve national goals in a smooth way. In this regard, Malaysia ratified its National Agro-Food policy for 2011 to 2020 and replaced the National Agriculture Policy (DPN3) (Ismail, 2010).

The policy pointers show that it is also helpful in controlling disease outbreaks, reducing gap between demand and supply, malnutrition and exclusively hidden hunger and on the other side, the availability of safe and quality food, more versatile food items and hazard analysis are good frames of picture. All these efforts would be

fruitless if farmers and allied stakeholders do not pay attention to the risk management side of agriculture.

Furthermore, Arshad *et al.* (2011) stated that Malaysia's main focus of food security is on rice on account of wider consumption however, still self sufficiency even in paddy production is uncertain. On the other hand, Indrani *et al.* (2001) argued that food sufficiency level is decreasing on annual basis in Malaysia because agriculture sector is more focusing on cash crops but less on food. They further added that food is being imported even there is potential to furnish local food demand. They suggested that all the players particularly government is required to change the priorities in order to ensure food security in Malaysia and role of new technologies are still unclear.

So, ICTs have potential to help in curbing issues which might create hurdles in the way of progress and prosperity. However, it is still unclear that how these digital technologies could directly influence food security at national, regional and international level. There are natural disasters and climate change issues at the national level which need to be understand. Therefore, natural disasters and climate change is presented next.

1.5 Natural Disasters and Climate Change in Malaysia

Natural disasters are natural phenomenon and occur due to the climate changes and mostly produce economic shocks. These natural disasters appear in the form of earthquakes, floods, hill torrents, tsunamis, eruptions of volcanoes, droughts and hurricanes. National Security Council of Malaysia has defined disaster as “an incident that occurs unexpectedly, complex in nature, resulting in the loss of lives and damage to properties and the environment as well as interfering in the daily activities of the local community” (Shaari *et al.*, 2016).

Climate change has become burning issue not only in Malaysia but also in other developing and developed countries. Oxford dictionary has defined it as “changes in the earth's weather, including changes in temperature, wind patterns and rainfall, especially the increase in the temperature of the earth's atmosphere that is caused by the increase of particular gasses, especially carbon dioxide”.

Agriculture sector has been facing many climatic variations which directly or indirectly affecting crop yield and quality of food. There are growing concerns of climate variations and its impact on agriculture sector. On account of these changes, agriculture has become riskier and risk management is mandatory to mitigate the impacts. History reveals that Malaysia has faced many floods and other catastrophes.

The flood history depicts that more than 300, 000 of population affected in the flood of 1965. Moreover, the series of floods were also recorded due to tropical storm Greg in the Sabah in the year 1996, caused 97.8 million US dollars damage to physical infrastructure including houses and other valuable properties. Floods due to heavy and continuous rain in Terengganu and Kelantan caused more than 0.35 million US dollars damage to properties and infrastructure in 2000. Additionally, the floods in Johor (2007) caused 489 million US dollars damage to physical infrastructure and properties. So, in light of the aforementioned facts and figures, the total cost of damage also affected economic growth (Shaari *et al.*, 2016).

Malaysia has also witnessed severe disasters in the form of droughts. Like drought in Malacca (1991) became cause of drying Durian Tunggal Dam and affected water availability in almost all areas of the state. Similarly, 1997-1998 El Nino-associated droughts are perceived as the most significant drought which had adversely affected society and environment at the national level. In addition, widespread of forest fires on account of long dry conditions endangered many areas of the country. This situation was further jeopardized the health situation of common people in the country after similar situation was observed in the bordering country and became cause of haze problem (Mustafa, 2007).

Drought in the 1998 severely affected the state of Sabah due to scarcity of rainfall. The rainfall was absent for a period of four to nine months. In result, 170,000 people and approximately 2,797 km² were affected. Moreover, wild fires affected nearly 1580 Km² in which 100 Km² were occupied by agricultural lands and there were >7200 farmers who also got affected. The mostly damaged crop was paddy crop as it was completely wiped out. The total loss was measured nearly 87 million Ringgits. The similar condition was also observed in the northern side of Sarawak (around Miri). Due to continuous dry spell, wild fires damaged a huge agricultural area (Mustafa, 2007).

El Nino linked drought in the period 1997-1998, a huge rainfall deficiency of 75% was witnessed nearly all parts of Sabah for a duration between four to nine months and even in few areas the rainfall deficit was approximately 90%. Additionally, the longest drought was recorded > 100 days in Miri (Sarawak) and in this context, Sulaiman (2007) stated that it was the longest drought, as per records. Zakaria and Shaaban (2007) stated that climate changes would produce more droughts in the upcoming dry years (2028, 2029, 2034, 2042 and 2044) and more adverse hydrological conditions might be occurred including floods and droughts at the national level.

As the country either receives a large amount of rainfall in a year or experience dry spell, so, it draws the attention to take measures and get equipped in advance for any adverse situation in the upcoming years. Alam *et al.* (2010) cautioned that Malaysia is one of the high prone countries to climate change variations where livelihood and agriculture sustainability is at risk. In this regard, Malaysia containing population

more than 27 million and 5.9 million tons greenhouse gas (GHG) emitter (per capita) (Salahudin *et al.*, 2013), 2nd largest (per capita) GHG emitter in the list of ASEAN countries (Saxena, 2009), and shares 0.3% globally (Olivier *et al.*, 2012), need to plan accordingly. The activities show that the rank will step up in the list if temperature rises by 0.3°C - 4.5°C, which will result about 95 cm sea level rise over a century period. Hamdan *et al.* (2011) also confirmed that the negative impacts of climate change on farms and farmers are irresistible and farming community is lacking ability to adapt. After brief discussion on natural disaster situation on account of climate changes, the situation of ICTs is presented in the next heading.

1.6 ICTs in Malaysia

ICTs are actually the advance form of mass media. Radio, T. V, newspapers, postal services are mainly considered types of mass media as information and knowledge is communicated to large number of people in a society (Hassan *et al.*, 2010). However, there is a limitation of coverage in mass media case but due to globalization, the new forms of communication methods, tools and technologies have been invented to speed up the process with the salient feature of instant feedback. From the future perspective, it might be perceived the usage of ICTs as a local or national development parameter.

Malaysia is becoming a technology loving country as it reveals from the continuous adoption of technologies for effective communication and technology transfer which further highlights the endless future of ICTs in all spheres of life. Similarly, use of ICTs is mushrooming in Malaysia as these facilitate business and social interaction. From the business perspective, ICTs are making business more stronger than the past due to enabling environment and friendly policies at national and international level. In order to bridge the digital divide (BDD) gap at the national level, special budget were allocated for investment with the aim to connect all citizens of Malaysia by establishing 1,945 telecentres across all 13 states (Norizan and Jalaluddin, 2008).

Digital Malaysia master plan was developed to transform the country as the way to achieve socio-economic development and digital penetration for national prosperity by the year 2020. It is assumed that there would not be digital divide in the year 2020 as it could be used in all sectors. In this regard, Global Science and Innovation Advisory Council (GSIAC), Malaysia has been established in 2011. This council has been given mandate to give valuable insights and provide roadmap for Digital Malaysia in order to bolster national economy. This initiative would lead to become ICT based leading nation among the ASEAN countries. More importantly, it seems that these efforts would boost agricultural sector and ultimately affect farmers and their behavior.

In the current scenario, the development of industries and social activities are not just rely on employees' skills but also proper execution of digital policies. The studies on association between ICT friendly policies and GDP have uncovered positive

correlations along with socio-economic developments as these have produced socio-economic advantages (Mody, 1995).

In this context, first survey report about ICT usage and access by individual and household level was issued by Department of Statistics, Malaysia in 2013. The ICT usage by an individual contains three items namely mobile phones, computers and the internet. On the other hand, household level access and usage comprised six ICTs which were landline phone, radio, T. V, T. V channel (paid), computer and internet. It would be worthy to mention here that their survey was based on International Telecommunication Unit (ITU) manual instructions and guidelines.

The survey findings show that mobile phones were used by 94.2%, computers were used by 56% and internet was used by 57% at the individual level in the country. So, among these, mobile phones were used by majority of Malaysian people. They further found that there were about 60.3% of the individuals who used internet on daily basis (Figure 1.3) while, 30.2% individuals used on weekly basis and only 2.8% of the individuals used less than one in a month basis. The activities on internet were mostly social activities like sending and receiving messages, emails; watching or downloading games, movies; buying food or personal items; travel inquiries; and reading electronic books, magazines or newspapers. In a nutshell, similar researches have been also done to assess the individual use of ICTs in various other countries but use of ICTs in agriculture and agricultural risk management have been a matter of limited researchers' concern.

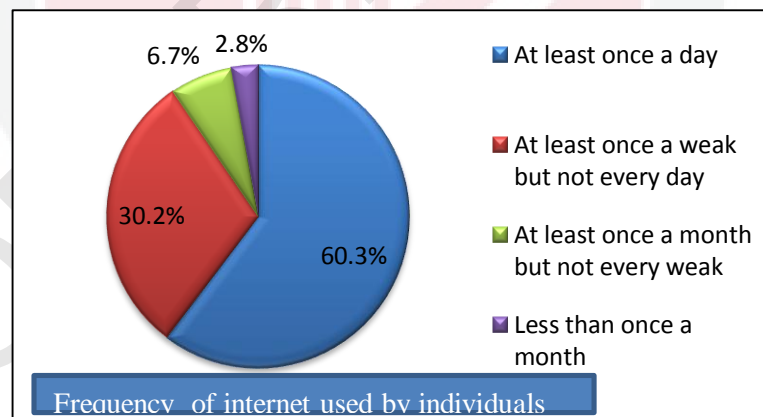


Figure 1.3 : Frequency of Internet used by Individuals
(Source : Department of Statistics, Malaysia 2013)

As far as ICTs access at household level is concerned, the survey results indicate that T. V was accessed to 98.2% of the household, followed by mobile which was 97% accessible. Whereas computer by 59.4%, internet to 58.6%, T. V channel (paid) to 56.1% and landline phone were in the access of 31.1% households. So, television and mobile were the main ICTs which were in the access of mostly households.

In fact, internet access is improving day by day but still 41.4% of the households are lacking home internet access, as the report declared. The reasons of lacking access were high cost, lack of proper skills or confidence, limitation of time, lack of personal interest and language problem. High cost and lack of interest, skills or confidence were comparatively higher in rural parts than urban areas at the national level. After getting picture of ICTs at national level, the ICTs situation in rural areas of Malaysia is pictured in the next topic.

1.7 ICTs in Rural Malaysia

ICTs are not only flourishing in urban areas but also in rural areas of Malaysia too. The concept of urban and rural digital divide is diminishing day by day if the infrastructure is good, connectivity is remarkable, access and affordability is not issue for the common users. The recent progress in ICT sector has opened new horizons due to flow of knowledge (Chapman and Slaymaker, 2002) and information sharing and has become prime source of personal capacity strengthening (Nor Iadah *et al.*, 2010).

The previous studies reveal that there were many projects and programmes in rural areas of Malaysia to reduce gap in digital divide concept and connect rural areas with the modern world of technologies. The involvement of public, private and NGOs sector to bring development in rural communities by the introduction of ICTs is remarkable. The programmes by the Government in sensitization and development by the use of ICTs in rural communities were telecentres, Medan InfoDesa, Universal Service Provision and Rural Internet Centre (PID) are name a few. According to Rashid and Hassan (2012), these programmes are now act as ICT training centers in promoting knowledge and creating various development activities and particularly rural entrepreneurship.

The telecenter programme for rural areas was initiated in the year 2000 with the help of government agencies namely Ministry of Rural and Regional development, Ministry of Water, Energy and Commission, Malaysian Communications and Multimedia Commission (MCMC) and state level governments (Tahir *et al.*, 2016). According to Tahir *et al.* (2016), the telecenters can be divided into three phases starting from 2001 to 2020. The 1st phase was between the years 2001 to 2010 in which these were established in rural areas on account for solving digital gap. The 2nd phase was between 2011 to 2015 in which bridging the digital gap was done. And the 3rd phase was started in 2016 and will end up in 2020 with the aim to upgrade these telecentres to become independent, advance and vigorous.

In the context of telecentres, Abu Samah *et al.* (2013) opined that these centers were aimed at bringing digital access, helping rural masses to increase their level of ICTs literacy and facilitating to access information and knowledge about various fields like general development, agriculture, business, health and local governance. Whereas, Norizan and Jalaluddin (2008) highlighted that these centers bolsters online activities of the rural masses in e-government and e-commerce programmes, helps to control

youth migration from rural to urban areas for employment along with socio-economic development through the use of ICTs.

Rashid and Hassan (2012) described the benefits of telecentres for rural communities were many, ranging from socio-economic development at local level, help in saving costs and time to diversified knowledgeable societies. On the other side of the coin, there were some challenges as well. These were lack of perception and motivation of the rural communities' specially illiterate and aged strata of society, technical and infrastructure hurdles, location and space issues, weaknesses in implementation of programmes, vested interests of the role players and underutilization of the programmes by the communities. While Zahurin *et al.* (2009) have also highlighted problems like absence of motivation, lack of proper physical facilities, scarcity of technical manpower, uncategorized users, inadequate hours of operation and less training programmes for IT.

Samsuddin *et al.* (2016) emphasized that ICTs have become very important in people's lives as they are helpful in information sharing, developments and bridging rural-urban digital divide even in Malaysia. They further added that ICTs are important communicating tools and also act as liaison in the context of community advancement so, communication among masses is difficult without ICTs in the present scenario. All in all, it depicts that ICTs in rural Malaysia is as important as ICTs in urban areas of the country. The links between risk management and ICTs are discussed in the upcoming topic.

1.8 Risk Management and ICTs

Risk management has become policy issue and striking attention of policy makers in the present agricultural policy reform in Malaysia and other developing nations (Chukwukere and Baharuddin, 2012). Lack of awareness to timely address the issue of risk management in agriculture lead people and specially small holding farmers into poverty and food scarcity which is ultimate cause of socio-economic and food insecurity issue (Hansen *et al.*, 2018). Therefore, public and private sectors of Malaysia are struggling to reduce the impact of natural calamities.

In order to provide information on time regarding strong winds plus weather situation, likelihood of disasters (floods, drought, hill torrents, heavy rains, cyclones, tsunami), price variations of produce in market or policies of government, knowledge regarding farmers and their nature of required data is a pre-requisite (NDMA, 2007). Indeed, if the required information or data is inaccurate or absent, then farmers feel uncertain and may face more risks. Thus, awareness and knowledge play vital role in taking decisions for adaptation, mitigation and addressing the issue in order to avoid production, market and other kinds of risks.

According to Chong *et al.* (2018), risk reduction need various actions in order to prepare the community and capacity building is also required to reduce impacts. The socio-economic and human losses may be reduced when community is having high level of awareness and advance knowledge on preparation of disasters and mitigation techniques.

Aziz and Yusoff (2014) conducted study in Malaysia and concluded that different kind of risks were faced by Malaysian agropreneurs. The authors added that the respondents had limited knowledge and financial access but still willing to face any kind of natural disasters to continue their projects. While, Bekhet and Latif (2018) argued that technological innovation and strategic policies are mandatory for Malaysian sustainable growth. These technological innovations may be slow but surely help in future progress if well planned and executed.

The use of ICTs in the agricultural sector is not a novel approach. However, the latest tools, techniques and technologies such as cell phones, portable devices, internet, digital softwares, web portals are in the initial stages. Therefore, various questions regarding their use, role and potential in the domain of agriculture are important. Torero and Braun (2006) stated that access to ICTs could positively lead to poverty alleviation and sustainable rural development. However, awareness may also reduce poverty and burgeon economic growth but evidences are still missing (Bhavnani *et al.*, 2008). Importantly, weaknesses at institutional level could further halt the pace of ICT contributions on account of ability to explore. Thus, assessment of various aspects of institutions involved could help in enhancing benefits to the poor directly (Mittal, 2012).

The prospective role of ICTs may be bifurcated into two elements; a) information access and networking -which are important in the research–extension–farmer–market interface and b) the technology diffusion process. For the first role, ICT usage may give many benefits to farming community and other plays like timely information about inputs (price and availability of seed, fertilizer, pesticides, irrigation); easy approaches to animal and crop insurance and credit facilities. For the second role, numerous studies that have revealed the ICT usage in disseminating knowledge and technology to producers, but there are concerns about the limited understanding of the impact of this intervention on the farmers' behavior, and its capacity to act as an enabler of technology adoption (Ali and Kumar, 2011; Aker, 2011). There is a need to examine the role of agriculture agencies which is highlighted next in the context of extension services and ICT usage in agriculture as a whole.

1.9 Role of Agriculture Agencies and ICT Usage in Agriculture

Agriculture agencies either public or private are key players from technology transfer to technology acceptance among farming community around the globe. The role of both important agencies kept changing due to need and demand of the users and end users. According to Swanson and Samy (2002), the public extension role in agriculture has

been changing in developing world since decades due to budget constraints and intervention of private extension agencies. Actually, in the extension linear system, innovations in agriculture are generated from researchers (innovators) which are extended by extension professionals and ultimately adopted by farmers (Pamuk *et al.*, 2013). Agriculture extension system plays leadership and coordinating role among stakeholders so they need to continue work for sustainability of agriculture sector (Rajalahti, 2012; Swanson, 2008).

From the lens of history, public sector based extension system remained dominant before the late 20th century however, after that many kind of organizations including private agencies started delivering extension services to the farming community. Interestingly, even public and private agencies joined hands to provide extension services for better livelihood of farmers (Swanson and Samy, 2002).

Christoplos (2010) has highlighted the importance of extension and advisory services as package of activities which offers valuable information and services required by farming community and related stakeholders to help in building their various skills like technical, managerial and organizational alongwith practices to ameliorate their living standards. The author further maintained that extension agencies can help in making informed decisions and also increase the resilience capacity of farming community by transferring knowledge and information about weather forecasts, market prices and demands by the buyers.

According to Singh and Grover (2013), there is prime role of public and private agencies as agriculture extension and advisory service providers in transferring information, education and technologies related with climate change and mitigation. Additionally, extension links farmers with researchers and other important players in the whole system. Another important activity of extension agencies is capacity development through adult and non formal education particularly in the context of climate change (Singh and Grover, 2013). That is why Ozor (2010) emphasized that there is a change required in roles and capacities in the whole extension scenario to overcome issues caused by climate change. Ani *et al.* (2015) stated that there is a nexus between resilience of farmers regarding agriculture risks and extension services. In this regard, Mittal (2012) noted that risks can be minimized when a farmer gets updated, quality oriented information and able to use that information. Thus, this valuable knowledge and up to date information is provided by agriculture extension agencies in any area.

According to Takenaka (2006), state departments (agricultural extension) in Asian countries are aimed to educate farming community but they have not been able to make any significant changes on account of various shortcomings namely weak structure (organizational), less contribution of farmers in the existing development progress, lack of mechanism for appreciation and rewards for good extension work and communications gaps among various stakeholders (policy makers, farmers,

extension staff, planners and researchers). Thus, there is dire need to revise extension mechanism to become more proactive to handle the issues (Baig and Aldosari, 2013).

Baig and Aldosari (2013); Kulkarni and Sonawane (2017) and Rohila *et al.* (2017) also highlighted the emerging role of ICTs grafted with extension services and would have significant impacts (Rao and Meera, 2017). The authors (Baig and Aldosari, 2013) further added that IT has also brought revolution in the agriculture agencies (extension) role however its true potential has yet to be made clear.

In fact, agriculture agencies are more inclined naturally to incorporate ICTs for quick transfer and delivery of information to the end users. In this context, Behera *et al.* (2015) pointed out that agriculture extension has started relying on IT due to information transfer on quick basis which could be apt to the area and situation on the basis of farmers' perceptions. Sanusi *et al.* (2010) revealed that agriculture professionals and farming community have started using digital means for effective message delivery, information exchange and managing the received information for good results which is a sign of agriculture development as a whole.

However, There could be number of factors which influence decision of farmers to use ICTs in agriculture. Some important factors pointed out by Caseli and Coleman (2001) are high cost, skills and competition and lacking these could inhibit the farmers to use ICTs. But, staff of agriculture agencies try to mould the attitude, intention and behavior of farmers to use and adopt various technologies for personal and agricultural development.

Similarly, extension workers are act as important link between government and farming community, transfer important pieces of information (Tiraieyari *et al.*, 2014) and facilitate farmers in solving agriculture related problems. Cristoplos (2010) explained that farmers and particularly smallholders are facing numerous problems with reference to climate change. So, in order to deal with risk, small holding farmers required new methods of extension services which can help them in understanding and managing agricultural risks. In order to deal with these kind of resource-poor farmers, extension and advisory service (EAS) must be demand driven, farmer friendly and facilitate in providing up to date information and knowledge about climate variations, rain and windfall patterns, latest input prices in market, microfinance and other requirements.

It can be forecasted that future generations will harness ICTs for maximum agriculture production and receive more profits than the existing one. As everything is becoming digitalised, so this digitalization will attract more users to manage variety of risks in an expert manner. However, science cannot compete with nature but the only option is to manage in certain boundaries. Next, conceptual and operation definitions used in this study are presented and later, the picture about the issue in the form of problem statement is presented next.

1.10 Problem Statement

Agriculture sector plays a significant role in food security at the regional and national levels but this sector is still countering problems with nature in the form of floods, drought and diseases (Alam *et al.*, 2010b). Similarly, it is a dilemma that the effects and after effects are being faced by farmers directly who have been adhered with this sector since a long time as a prime source of bread and butter. Ultimately, these issues are influencing human behavior and their decisions. If this problem persists, then country and its inhabitants (farmers) would face more serious problems.

Beyond doubt, public and private sectors have facilitated farmers to harness potential of ICTs to solve the issues (Istikoma *et al.*, 2015; Yusop *et al.*, 2013). Even, Malaysian government has tried to establish good physical infrastructure so that people can take benefits through digital means (Shaffril *et al.*, 2012). The stakeholders involved in agriculture sector have motivated, mobilized and disseminated these digital technologies among farming community to cope with the natural problems. Now, it is dire need to understand farmers' behavioral intention to use ICTs in the risk management of agriculture sector as these are speedy, cheap, timely and easy to operate.

Mittal (2012) in his one of the working papers reported that if the farmer is well informed and skilled to use ICTs then the expected risks can be minimized. In addition, the author further found that among various latest ICTs, cell phones have proved to be widely accepted on account of their use and medium of exchanging information in India, other Asian countries and Africa. The use of mobile phones have been increasing due to easy availability of particular information and it is enhancing awareness, source of education, support in technology adoption, fewer costs on transactions, superior market efficiency and better risk management linked with climate. According to Chhachar and Hassan (2013), farmers of Malaysia have also started using ICTs particularly mobile phones in the agricultural sector. However, there is a still need to identify various ICTs being used by farmers of selected states of Malaysia in the context of agricultural risk management.

The existing literature revealed that there were many factors which could influence the intention of farmers to use ICTs. The factors related to socio-demographic are (Srinuan, 2016; Jiriko *et al.*, 2015; Moghaddam and Khatoon-Abadi, 2013; Venkatesh *et al.*, 2003; Cheong, 2002) age (Cheong, 2002), educational level (Ali and Kumar, 2011; Cheong, 2002), income (Cheong, 2002), experience (Cheong, 2002), farm size and land ownership. Additionally, there are other influencing factors like attitude (Adegbidi *et al.*, 2012; Hsu and Chiu, 2004), subjective norms (Venkatesh and Morris, 2000), perceived behavioral control and behavioral intention which are related with ICT use (Ajzen, 1991). On the other side of the coin, there is lack of literature which could reveal the factors influencing farmers intention to use ICTs for agricultural risk management.

Furthermore, this study was designed to determine the existing level of attitude, subjective norms, perceived behavioral control and intention of respondents to use ICTs for agricultural risk management. On top of that, the role of extension agencies rendering services in transferring information and technologies to manage agricultural risk also demands to be clarified in Malaysia. Although extension functionaries are providing services to farmers (Tiraieyari *et al.*, 2014) through mass media as form of ICTs (Hassan *et al.*, 2010) but, their services to use ICTs for managing agricultural risk are still questionable. If the problem is not given priority yet then it will affect on livelihood of farmers particularly and agriculture sector generally.

The research questions and objectives are very important in all the empirical studies, so these important points are mentioned next.

1.11 Research Questions

The research questions for this study:

- 1) What are the ICT technologies used by farmers, their sources of information, adaptation toward risk management, social networks and agriculture extension services?
- 2) What are the respondents' attitude, subjective norms and perceived behavioral control toward intention to use ICTs for management of agricultural risk?
- 3) What are socio-demographic factors that can affect the intention of farmers to use ICTs for agricultural risk management?
- 4) What is the relationship between attitude, subjective norms, perceived behavioral control and intention to use ICTs for agricultural risk management?
- 5) What is the influence of attitude, subjective norms and perceived behavioral control on farmers' intention to use ICTs for agricultural risk management?

1.12 Objectives of the Study

1.12.1 General Objective

The overall objective of this study was to determine management of risk in agriculture sector through the application of ICTs in selected states of Malaysia.

1.12.2 Specific Objectives

Specifically, the objectives of this study were:

- 1) To identify the ICT technologies, sources of information use, agriculture extension services, existing networks and adaptation by the respondents in managing agricultural risk.
- 2) To examine attitude, subjective norms, perceived behavioral control and intention level to use ICTs for agricultural risk management.
- 3) To evaluate the relationship between socio-demographic factors and intention level to use ICTs for managing agriculture risks by the respondents.
- 4) To assess relationship between attitude, subjective norm, perceived behavioral control and intention to use ICTs for agricultural risk management.
- 5) To determine the influence of attitude, subjective norms, perceived behavioral control (IVs) on the intention (DV) of farmers to use ICTs for risk management in agriculture.

1.13 Significance of the Study

The significance of this study is manifold. It would help in realizing the importance of ICTs and agricultural risk management in the present and future context. From the theoretical point of view, this study would contribute in understanding perceptions about respondents attitude, subjective norms, perceived behavioral control and behavioral intention of farmers toward ICTs use for agricultural risk management. The researchers have also opined that agricultural risk management through ICTs is still naive as some work has been done in developed countries but for Malaysia and other developing parts of the world, it may be comparatively new and less focused particularly in the field of agriculture extension and rural advisory services.

The present study would also add value in understanding existing situation of ICTs adoption as perceived by farmers. These would further capture attention of policy makers, extension service providers, academia and farmers to harness untapped potential of digital technologies in the agriculture sector. Similarly, various types of ICTs which are being used and further can be used would assist development agencies in the future projects. This might also urge the opinions of various actors in planning to support or not to support ICTs in management of various risks in farming.

From the lens of real life, this study would contribute in enabling various stakeholders associated with the agriculture sector to manage the risks by using ICTs as speedy and effective means of communication. This would also help extension staff of public and private sector to reach and transfer technologies among farmers quickly. Many countries are already experiencing the shortage of extension field staff so ICTs can be proper and timely remedy in the present scenario.

The results of the study would benefit a number of relevant players namely farmers, policy makers and in practice theories. The Malaysian farmers could be in a better position to use and adopt new types of ICTs for agricultural risk management. In addition, paradigm shift from traditional agriculture to ICT based practices would enhance production and protection of self food security issue at the local level. It is

expected that farmers and farmers' organizations would be ready in advance to tackle any natural hazard forecasted to occur.

The results would also be useful for policy makers from public and private sectors. As a need and demand, the government officials will propagate digital activities on state of the art design. It would help in adding ICTs in the policy pointers for farmers and especially for smallholder farming strata of Malaysia. It would open doors for Malaysian state officials attached with agriculture sector to devise and revise policy in favor of farmers who are prone to natural disasters. On top of that, the best practices of risk management could be replicated in other states through the adoption of digital means.

This study would also contribute towards the theory development as it could offer new insights for researchers towards ICT as technology acceptance in the context of agricultural risk management. Additionally, the role being played by rural advisory service providers in technology transfer and technology acceptance could stimulate the stakeholders including farmers to integrate digital means for agricultural risk management. The present study would also offer assistance to the researchers in understanding influence of socio-demographic features on behavioral intentions of farmers regarding ICTs usage for agricultural risk management.

1.14 Conceptual and Operational Definitions of the Terms

There are certain terminologies which have been used and required to understand for clarity. These terms are given below:

1.14.1 Knowledge

a) Conceptual

According to Nonaka (1994), knowledge is “justified true belief”.

b) Operational

In this study, knowledge refers to the personal belief of respondents about agricultural risk management.

1.14.2 Attitude

a) Conceptual

Ajzen (1991) has defined as “the degree to which an individual favors the behavior being examined”.

b) Operational

Attitude in this study has been understood as farmers’ positive or negative assessment of behavioral performance to use or not to use ICTs for managing agriculture risk (s). It can be unveiled through individual belief pertaining to the behavior.

1.14.3 Subjective Norms

a) Conceptual

According to Ajzen (1991), subjective norms is “the social pressure that makes a person to perform a particular behavior”.

b) Operational

In this study, subjective norms means the perception of individual farmer to socially accept ICTs for managing agriculture risks.

1.14.4 Perceived Behavioral Control

a) Conceptual

Perceived behavioral control is described by Ajzen (1991) as “the perceived ease or difficulty of performing the behavior”.

b) Operational

In this study, PBC means how well respondents (farmers) are able to use different ICTs and manage agriculture risks.

1.14.5 Intention

a) Conceptual

According to Ajzen (1991), the most close behavioral predictor is the behavioral intention. It shows the strength of an individual that how that individual is self motivated and willing to perform that specific behavior.

b) Operational

In this study, intention means behavioral intention which mirrors the motivation and self inclination of respondents to use ICTs for agricultural risk management.

1.14.6 Extension Services

a) Conceptual

Extension services are defined by Rivera and Qamar (2003) as “a non-formal educational function that involves the dissemination of information and advice with the intention of promoting knowledge, attitudes, skills and aspirations”.

b) Operational

In this study, the agriculture extension services mean the services rendered by public and private sector in facilitating farmers to manage agricultural risks and/or use ICTs for agricultural risk management. Thus, extension services rendered by public and private sector have been evaluated through the frequency of meetings, support extended, trainings imparted, information delivered at the farmers’ level. Ultimately, a brief picture of extension service providers appeared to further distil the role played regarding agricultural risk management and promotion of ICTs among farming community.

1.14.7 Agricultural Risk Management

a) Conceptual

According to Williams and Schroder (1999), a state of risk is supposed to exist whenever knowledge of the situation enables the likelihood of the numerous possible events to be evaluated in advance. So, risk management is “the process for designing, implementing and evaluating strategies, policies and measures to improve the understanding of disaster risk, foster disaster risk reduction and transfer, and promote continuous improvement in disaster preparedness, response and recovery practices,

with the explicit purpose of increasing human security, welfare, quality of life and sustainable development” (IPCC, 2012).

b) Operational

In this study, risk management has been seen in the context of farms and farmers. Additionally, awareness, perception of knowledge, adaptation, sources of risks and components of TPB were also captured.

1.14.8 Information and Communication Technologies (ICTs)

a) Conceptual

According to Selwyn (2002), ICTs is an umbrella term which comprises computer software and hardware, telecommunication technologies, broadcasting through digital means along with digital sources of information which may be online or offline. The European Commission (2001) has defined it in a more comprehensive manner as "a wide range of services, applications and technologies, using various types of equipment and software, often running over telecommunications networks".

b) Operational

In the domain of this study, various types of ICTs use and/or intention to use for agricultural risk management to facilitate in communication and information sharing have been seen.

1.15 Thesis Organization

The thesis is divided into five (5) chapters and the further detail is given below.

- 1) Chapter 1 covers the introduction, background, Malaysian agriculture sector, national agriculture and food security policies, climate change and its impacts, risk management and its use in ICTs, role of agriculture agencies and ICT usage in agriculture. Furthermore, this chapter has also described problem statement, study objectives, research questions, significance and conceptual and operational definitions of important terms.
- 2) Chapter 2 explains literature review about climate change in agriculture, natural disasters, risk management in agriculture, use of ICTs in agriculture and risk management, extension services, farmers based associations and social networks, theories and models related to technology acceptance including Theory of Planned Behavior and its components, and empirical literature related with ICTs and agricultural risk management.

- 3) Chapter 3 reveals conceptual framework, sampling frame, primary and secondary data sources, instrument design, problems faced during data collection, data processing and analysis techniques, reliability test, hypotheses formulation, chi square test, Pearson correlation and regression analysis.
- 4) Chapter 4 elaborates study results and detailed discussion along with statistical results. Moreover, results and discussion have deliberated keeping in mind research objectives, questions and hypothesis. Results are presented in descriptive and inferential form.
- 5) Chapter 5 highlights conclusions, policy implications, limitations of the study and recommendations for farmers, policy makers and allied actors.



REFERENCES

- Abid, M., Scheffran, J., Schneider, U. A., and Ashfaq, M. (2015). Farmers' perceptions of and adaptation strategies to climate change and their determinants: the case of Punjab province, Pakistan. *Earth System Dynamics*, 6(1), 225.
- Abdullah, F. A., and Abu Samah, B. (2013). Factors impinging farmers' use of agriculture technology. *Asian Social Science*, 9(3), 120-124.
- Abu Samah, B., Badsar, M., Abu Hassan, M., Osman, N., Shaffril, M., and Azril, H. (2013). Youth and telecentres in community building in rural Peninsular Malaysia. *Pertanika Journal of Social Sciences and Humanities*, 21(spec. July), 67-78.
- Adger, N., Hughes, T. P., Folke, C., Carpenter, S. R., and Rockstorm, J. (2005). Socio-ecological resilience to coastal disasters, *Science*. 309. 5737. 1036-1039.
- Adger, W. N., and Kelly, P. M. (1999). Social vulnerability to climate change and the architecture of entitlements. *Mitigation and Adaptation Strategies for Global Change*, 4(3-4): 253-266.
- Adegbidi, A.B., Mensah, R., Vidogbena, F. and Agossou, D. (2012). Determinants of ICT use by rice farmers in Benin : From the perception of ICT characteristics to the adoption of the technology. *Journal of Research in International Business and Management*, 2, 11, 273-284.
- Aditto, S., Gan, C., and Nartea, G. (2012). Sources of risk and risk management strategies: the case of smallholder farmers in a developing economy. In *Risk management-current issues and challenges*. InTech Open Access Publisher. Doi. 10.5772/50392.
- Adnan, N., Nordin, S. M., Rahman, I., and Noor, A. (2017). Adoption of green fertilizer technology among paddy farmers: A possible solution for Malaysian food security. *Land Use Policy*, 63, 38-52.
- Agwu, A. E., and Adeniran, A. A. (2009). Sources of agricultural information used by arable crop farmers in Isale Osun farm settlement, Osogbo local government area of Osun State. *Journal of Agricultural Extension*, 13(1).
- Ahsan, D. A., and Roth, E. (2010). Farmers' perceived risks and risk management strategies in an emerging Mussel aquaculture industry in Denmark. *Marine Resource Economics*, 25(3): 309-323.
- Ajzen I., and Fishbein, M. (1980). *Understanding attitudes and predicting social behavior*. England Cliffs, NJ: Prentice-Hall.

- Ajzen, I. (1985). From intentions to actions: a theory of planned behavior. In Kuhl, J., Beckman, J. (Eds.), *Action control: from cognition to behaviour* (pp. 11-39). Heidelberg, Germany: Springer.
- Ajzen, I. (1991). The Theory of Planned Behavior. *Organ. Behav. Hum.*, 50: 179-211.
- Ajzen, I. (2002). Perceived behavioral control, self-efficacy, locus of control, and the theory of planned behavior. *Journal of Applied Social Psychology*. 32(4): 665–683.
- Ajzen, I. (2015). Consumer attitudes and behavior: the theory of planned behavior applied to food consumption decisions. *Rivista di Economia Agraria/Italian Review of Agricultural Economics*, 70(2), 121-138.
- Akcaoz, H., and Ozkan, B. (2005). Determining risk sources and strategies among farmers of contrasting risk awareness: A case study for Cukurova region of Turkey. *Journal of Arid Environments*.
- Aker, J. C. (2011). Dial “A” for agriculture: a review of information and communication technologies for agricultural extension in developing countries. *Agricultural Economics*, 42(6), 631-647.
- Al-Ajam, A. S., and Nor, K. M. (2013). Customers’ adoption of Internet banking service: An empirical examination of the theory of planned behavior in Yemen. *International Journal of Business and commerce*, 2(5), 44-58.
- Alam, M. M., Siwar, C., and Al-Amin, A. Q. (2010). Climate change adaptation policy guidelines for agricultural sector in Malaysia. *Asian Journal of Environmental and Disaster Management*, 2(4), 463– 469.
- Alam, M. M., Siwar, C., bin Toriman, M. E., Molla, R. I., and Talib, B. (2012). Climate change induced adaptation by paddy farmers in Malaysia. *Mitigation and Adaptation Strategies for Global Change*, 17(2), 173-186.
- Alam, M. M., Siwar, C., Jaafar, A. H., Talib, B., and Salleh, K. O. (2013). Climate change adaptability of farmers: Malaysian case study. *International Journal of Plant, Animal and Environmental Sciences*, 3(3): 130-135.
- Alam, M. M., Siwar, C., Murad, M. W., and Mohd Ekhwan, T. (2011). Impacts of climate change on agriculture and food security issues in Malaysia: an empirical study on farm level assessment, *World Applied Sciences Journal*, 14(3), 431-442.
- Alam, M., Siwar, C., and Toriman, M. E. B. (2010b). *Socioeconomic study of climate change: an assessment of agriculture and livelihood sustainability on Paddy farming in Malaysia*, LAP Lambert Academic Publishing: Saarbrucken, Germany.

- Alam, S. S., and Sayuti, N. M. (2011). Applying the theory of planned behavior (TPB) in halal food purchasing. *International Journal of Commerce and Management*, 21(1), 8-20.
- Alampay, E. A. (2006). Analysing socio-demographic differences in the access and Use of ICTs in the Philippines using the capability approach. *EJISDC: The Electronic Journal on Information Systems in Developing countries*, 27(5), 1-39.
- Alavion, S. J., Allahyari, M. S., Al-Rimawi, A. S., and Surujlal, J. (2017). Adoption of Agricultural E-Marketing: Application of the Theory of Planned Behavior. *Journal of International Food and Agribusiness Marketing*, 29(1), 1-15.
- Al-Debei, M., Al-Lozi, E., and Papazafeiropoulou, A. (2013). Why people keep coming back to Facebook: Explaining and predicting continuance participation from an extended theory of planned behavior perspective. *Decision Support Systems*, 55(1), 43-54.
- Aldosari, F., Al Shunaifi, M. S., Ullah, M. A., Muddassir, M., and Noor, M. A. (2017). Farmers' perceptions regarding the use of Information and Communication Technology (ICT) in Khyber Pakhtunkhwa, Northern Pakistan. *Journal of the Saudi Society of Agricultural Sciences*.
- Alexander, D. E. (1993). *Natural Disasters*. Dordrecht, Netherlands: Kluwer Academic Publishers.
- Ali, J., and Kumar, S. (2011). Information and communication technology (ICT) and farmer's decision making across the agricultural supply chain. *International Journal of Information Management*, 31(2), 149-159.
- Altieri, M. A. (2002). Agroecology: the science of natural resource management for poor farmers in marginal environments. *Agriculture, Ecosystems and Environment*, 93(1), 1-24.
- Angelica, V. O., Dickerson, K., and David, F. (2014). *Resilient pathways: the adaptation of the ICT sector to climate change*. Geneva, Switzerland: International Telecommunication Union (ITU).
- Ani, A. O., Chikaire, J. U., Ogueri, E. I., and Orusha, J. O. (2015). The role of Information and communications technologies in agricultural risk management in Owerri agricultural zone, Imo State, Nigeria. *Global Journal of Biology, Agriculture and Health Sciences*. 7-11.
- Antle, J. M. (1987). Econometric estimation of producers' risk attitudes. *American Journal of Agricultural Economics*, 69(3), 509-522.

- Antwi-Agyei, P., Dougill, A. J., Fraser, E. D., and Stringer, L. C. (2013). Characterising the nature of household vulnerability to climate variability: empirical evidence from two regions of Ghana. *Environment, Development and Sustainability*, 15(4), 903-926.
- Armagan, G., and Ozden, A. (2009). Entrepreneurial Attitudes and Behaviours in Small-Scale Dairy Farms in Turkey, 111 EAAE-IAAE Seminar 'Small Farms: Decline or Persistence', University of Kent, Canterbury, UK, 26-27 June.
- Armitage, C. J., and Conner, M. (2001). Efficacy of the theory of planned behaviour: A meta-analytic review. *British Journal of Social Psychology*, 40, 471 - 499.
- Arshad, F. M., Alias, E. F., Noh, K. M., and Tasrif, M. (2011). Food security: Self-sufficiency of rice in Malaysia. *International Journal of Management Studies*, 18(2), 83-100.
- Artikov, I., Hoffman, S. J., Lynne, G. D., Zillig, L. M. P., Hu, Q., Tomkins, A. J., ... and Waltman, W. (2006). Understanding the Influence of Climate Forecasts on Farmer Decisions as Planned Behaviour. *Journal of Applied Metrology and Climatology*, 45 (9), 1202-1214.
- Ashraf, M., and Routray, J. K. (2013). Perception and understanding of drought and coping strategies of farming households in north-west Balochistan. *International Journal of Disaster Risk Reduction*, 5,49-60. doi: 10.1016/j.ijdr.2013.05.002.
- Austen, E. A., Sale, P. W. G., Clark, S. G., and Graetz, B. (2002). A survey of farmers' attitudes, management strategies and use of weather and seasonal climate forecasts for coping with climate variability in the perennial pasture zone of south-east Australia. *Animal Production Science*, 42(2), 173-183.
- Austin, O. C., and Baharuddin, A. H. (2012). Risk in Malaysian agriculture: The need for a strategic approach and a policy refocus. *Kajian Malaysia*, 30(1), 21-50.
- Aziz, N. A. A., Ismail, M., Aziz, N. A. A., and Aziz, N. N. A. (2014). Developing a theoretical model of agriculture takaful for paddy farmers in east coast Malaysia. In 3rd International Seminar on Entrepreneurship and Business (ISEB 2014). 14 December 2014, Hotel Perdana, Kota Bharu, Kelantan, Malaysia.
- Aziz, M. R. A., and Yusoff, M. M. (2014). Identifying risks of financing for agro projects in Islamic banks. *International Journal of Technical Research and Applications*.
- Babcicky, P., and Seebauer, S. (2015). The two faces of social capital in private flood mitigation: opposing effects on risk perception, self-efficacy and coping capacity. *Journal of Risk Research*, 1-21.

- Baez, J, De la Fuente, A., and Santos, I. (2010). Do Natural Disasters Affect Human Capital? An Assessment Based on Existing Empirical Evidence. IZA Discussion Paper No. 5164. Bonn: Germany. Institute for the study of labor (IZA).
- Bagheri, A., and Shabanali, F. (2016). Potato growers' risk perception: A case study in Ardabil province of Iran. *Journal of Agricultural Science and Technology*, 18(1), 55-65.
- Baig, M. B., and Aldosari, F. (2013). Agricultural extension in Asia: Constraints and options for improvement. *J. Ani Plant Sci*, 23, 619-632.
- Balaji, V., Meera, N., and Dixit, S. (2007). ICT-enabled knowledge sharing in support of extension: addressing the agrarian challenges of the developing world threatened by climate change, with a case study from India. *Journal of SAT Agricultural Research*, 4(1), 1-18.
- Baqutayan, S. M., Mohamad, R., Azman, R. R., and Hassan, N. A. (2017). The implementation of contract farming of fresh fruits and vegetables (FFV) for smallholders in Malaysia: government roles and initiatives. *Journal of Science, Technology and Innovation Policy*, 3(1).
- Bard, S. K., and Barry, P. J. (2000). Developing a scale for assessing risk attitudes of agricultural decision makers. *The International Food and Agribusiness Management Review*, 3(1), 9-25.
- Barnett, B. J., and Mahul, O. (2007). Weather index insurance for agriculture and rural areas in lower income countries. *American Journal of Agricultural Economics*, 89(5), 1241-1247.
- Barrett, C. B. (2010). Measuring food insecurity. *Science*, 327(5967), 825-828.
- Battacherjee, A. (2000). Acceptance of e-commerce services: the case of electronic brokerages. *IEEE Transactions on Systems, Man and Cybernetics*, 30, 411-420.
- Bayes, A., von Braun, J., and Akhter, R. (1999). Village pay phones and poverty reduction: insights from a Grameen Bank initiative in Bangladesh. ZEF Discussion Papers on Development Policy. Bonn, Germany, Center for Development (ZEF). (available at www.zef.de/fileadmin/webfiles/downloads/zef_dp/zef_dp8-99.pdf).
- Beal, D. J. (1996). Emerging issues in risk management in farm firms. *Review of Marketing and Agricultural Economics*, 64(03), 336-347.
- Behera, B. S., Das, T. K., Jishnu, K. J., Behera, R. A., Behera, A. C., and Jena, S. (2015). E-governance mediated agriculture for sustainable life in India. *Procedia Computer Science*, 48, 623-629.

- Bekhet, H. A., and Latif, N. W. A. (2018). The impact of technological innovation and governance institution quality on Malaysia's sustainable growth: Evidence from a dynamic relationship. *Technology in Society*. <https://doi.org/10.1016/j.techsoc.2018.01.014>
- Bellemare, M. F. (2015). Rising food prices, food price volatility, and social unrest. *American Journal of Agricultural Economics*, 97(1), 1-21.
- Below, T., Artner, A., Siebert, R., and Sieber, S. (2010). Micro-level practices to adapt to climate change for African small-scale farmers. A review of Selected Literature. *Environ. Prod. Technol. Division*, 953.
- Benkler, Y. (2006). *The wealth of networks: How social production transforms markets and freedom*. New Haven and London: Yale University Press.
- Bernier, Q., and Meizen-Dick. (2014). Resilience and social capital, Building resilience for food and nutritional security. IFPRI 2020 Conference. Addis Ababa, Ethiopia, May 17-19. Washington, D. C.: International Food Policy Research Institute (IFPRI).
- Berry, W. D. (1993). *Understanding regression assumptions*. Sage university paper series on quantitative applications in the social sciences, 07–92. Newbury Park, CA: Sage.
- Bertolini, R. (2004). Strategic thinking: making information and communication technologies work for food security in Africa. <http://www.ifpri.org/pubs/ib/ib27.pdf>
- Bhavnani, A., Rowena, W. W. C., Subramaniam, J., And Peter, S. (2008). The role of mobile phones in sustainable rural poverty reduction. Report, Washington, D.C., World Bank, ICT Policy Division, Global Information and Communications Department. USA.
- Binswanger, H. P. (1980). Attitudes toward risk: Experimental measurement in rural India. *American Journal of Agricultural Economics*, 62(3), 395-407.
- Birner, R., Davis, K., Pender, J., Nkonya, E., Anandajayasekeram, P., Ekboir, J., ... and Cohen, M. (2009). From best practice to best fit: a framework for designing and analyzing pluralistic agricultural advisory services worldwide. *Journal of Agricultural Education and Extension*, 15(4), 341-355.
- Blaikie, P., Cannon, T., Davis, I., and Wisner, B. (2014). *At risk: natural hazards, people's vulnerability and disasters*. New York, NY: Routledge.
- Bodin, Ö., and Crona, B. (2009). The role of social networks in natural resource governance: What relational patterns make a difference? *Glob. Environ. Chang.*, 19, 366-374.

- Bodin, Ö., and Norberg, J. (2005). Information network topologies for enhanced local adaptive management. *Environmental Management*, 35(2), 175-193.
- Boehlje, M. D. (1984). *Farm Management*, New York: John Wiley and Sons, Inc.
- Boko, M., Niang, I., Nyong, A., Vogel, C., Githeko, A., and Medany, M. (2007). Africa Climate Change 2007: Impacts, Adaptation and Vulnerability. Contribution of Working Group II to the Fourth Assessment Report of the Intergo. In M. L. Parry, O. F. Canziani, J. P. Palutikof, P. J. van der Linden, and C. E. Hanson (Eds.). Cambridge: Cambridge University Press.
- Bolong, J., Shaffril, H. A. M., Omar, S. Z., D'Silva, J. L., and Sahharon, H. (2016). Examining the Impacts of Behavioral factors on Wireless Village Services among Rural Community in Malaysia. *International Journal of Academic Research in Business and Social Sciences*, 6(6), 338-354.
- Bolte, J. P., Hulse, D. W., Gregory, S. V., and Smith, C. (2006). Modeling biocomplexity actors, landscapes and alternative futures. *Environmental Modelling and Software* 22, 570-579.
- Borges, J. A. R., and Machado, J. A. D. (2012). Risks and risk management mechanisms: An analysis of the perceptions of producers of agricultural commodities. *Interdisciplinary Journal of Research in Business*, 2(5), 27-39.
- Borges, J. A. R., Foletto, L., and Xavier, V. T. (2015). An interdisciplinary framework to study farmers decisions on adoption of innovation: Insights from Expected Utility Theory and Theory of Planned Behavior. *African Journal of Agricultural Research*, 10(29), 2814-2825.
- Bosnjak, M., Obermeier, D., and Tuten, T. L. (2006). Predicting and explaining the propensity to bid in online auctions: A comparison of two action-theoretical models. *Journal of Consumer Behaviour*, 5(2), 102-116.
- Bosnjak, M., Tuten, T. L., and Wittmann, W. W. (2005). Unit (non) response in web-based access panel surveys: An extended planned-behavior approach. *Psychology and Marketing*, 22, 489-505.
- Botterill, L., and Mazur, N. (2004). *Risk and risk perception: A literature review* (Issues 4-43). Kingstrom, ACT: Australian Government Rural Industries Research and Development Corporation (RIRDC).
- Botsiou, M., and Dagdilelis, V. (2013). Aspects of incorporation of ICT in the Greek agricultural enterprises: The case of a prefecture. *Procedia Technology*, 8, 387-396. <https://doi.org/10.1016/j.protecy.2013.11.051>.

- Bradford, R. A., O' Sullivan, J. J., Van Der Craats, I. M., Krywkow, J., Rotko, P., Aaltonen, J., Bonaiuto, M., De Dominicis, S., Waylen, K., and Schelfaut, K. (2012). Risk perception-Issues for flood management in Europe, *Natural Hazards and Earth System Sciences*, 12, 2299-2309.
- Bryan, E., Deressa, T. T., Gbetibouo, G. A., and Ringler, C. (2009). Adaptation to climate change in Ethiopia and South Africa: options and constraints. *Environmental Science and Policy*, 12(4), 413-426.
- Bubeck, P., Botzen, W. J. W., Kreibich, H., and Aerts, J. C. J. H. (2012). Long-term development and effectiveness of private flood mitigation measures: an analysis for the German part of the river Rhine, *Natural Hazards and Earth System Sciences*, 12, 3507-3518.
- Bubeck, P., Botzen, W. J. W., Kreibich, H., and Aerts, J. C. J. H. (2013). Detailed insights into the influence of flood coping appraisals on mitigation behaviour, *Global Environmental Change*, 23, 1327-1338.
- Burt, R. S. (2000). The network structure of social capital. *Research in Organizational Behavior*, 22, 345-423.
- Byerlee, D., and Anderson, J. R. (1982). Risk, utility and the value of information in farmer decision making. *Review of Marketing and Agricultural Economics* 50 (3): 231-246.
- Cadger, F., Curran, K., Santos, J., and Moffett, S. (2016). Location and mobility-aware routing for multimedia streaming in disaster telemedicine. *Ad Hoc Networks*, 36, 332-348.
- Cameron, L., and Shah, M. (2015). Risk taking behavior in the wake of natural disasters. *Journal of Human Resources*, 50(2),484-515.
- Campbell, D. J. (1999). Response to drought among farmers and herders in southern Kajiado District, Kenya: a comparison of 1972–1976 and 1994–1995. *Human Ecology* 27 (3): 377–416.
- Candland, C. (2000). Faith as social capital: Religion and community development in Southern Asia. *Policy Sciences*, 33(3), 355-374.
- Carter, M. R., Little, P. D., Mogue, T., and Negatu, W. (2007). Poverty traps and natural disasters in Ethiopia and Honduras. *World Development*, 35(5), 835-856.
- Caseli, F., and Coleman, W. J (2001). *Cross country technology diffusion: the case study of computers* (NBER Working papers No 8130). Cambridge: National Bureau of Economic Research.

- Central Intelligence Agency-CIA. (n.d.). *The World Fact Book: GDP - Composition, by sector of origin*. Retrieved from <https://www.cia.gov/library/publications/the-world-factbook>.
- Chalala, B. (2015). *Risk management and market participation among traditional cattle farmers in Monze district of Southern Province, Zambia* (Master dissertation in Agricommerce, The Massey University, Manawatu, New Zealand). Retrieved from <https://mro.massey.ac.nz/handle/10179/9872>.
- Chan, N. W. (2015). Impacts of disasters and disaster risk management in Malaysia: The case of floods. In *Resilience and Recovery in Asian Disasters* (pp. 239-265). Springer Japan.
- Chang, W. I., and Tuan, C. L. (2011). Market information needs risk assessment toward ICT usage for green: Bean producers in dakar region of senegal. *WSEAS Transactions on Computers*, 10(8), 235-246.
- Chhachar, A. R., and Hassan, M. S. (2013). The use of mobile phone among farmers for agriculture development. *International Journal of Scientific Research*, 2(6), 95-98.
- Chapman, R., and Slaymaker, T. (2002). *ICTs and Rural Development: Review of the Literature, Current Interventions and Opportunities for Action*. London Overseas Development Institute.
- Charvériat, C. (2000). *Natural disasters in Latin America and the Caribbean: An overview of risk* (Inter-American Development Bank, Research Department Working Paper No. 364). Washington, DC: Inter-American Development Bank.
- Chavas, J. P. (2004). *Risk Analysis in Theory and Practice*. Amsterdam: Elsevier/Butterworth Heinemann.
- Chester, D. (2005). Theology and disaster studies: The need for dialogue. *Journal of Volcanology and Geothermal Research*, 146(4), 319-328.
- Chester, D. K., Duncan, A. M., and Dibben, C. J. L. (2008). The importance of religion in shaping volcanic risk perception in Italy, with special reference to Vesuvius and Etna. *Journal of Volcanology and Geothermal Research*, 172(3-4), 216-228.
- Cheema, A. R. (2012). *Exploring the role of the mosque in dealing with disasters: a case study of the 2005 earthquake in Pakistan* (Doctoral dissertation, Massey University, New Zealand).
- Cheong, W. H. (2002). Internet adoption in Macao. *Journal of Computer Mediated Communication*, 7(2), 11-18.

- Chong, N. O., Kamarudin, K. H., and Wahid, S. N. A. (2018). Framework considerations for community resilient towards disaster in Malaysia. *Procedia Engineering*, 212, 165-172.
- Choudhry, V. (2015). *Agricultural risk management in the face of climate change*. Washington, DC: World Bank.
- Chikaire, J. U., Anaeto, F. C., Emerhirhi, E., and Orusha, J. O. (2017). Effects of use of information and communication technologies (ICTs) on farmers' agricultural practices and welfare in orlu agricultural zone of IMO state, Nigeria. *UDS International Journal of Development*, 4(1), 92-104.
- Chukwukere, O., and Baharuddin, A. H. (2012). Risk and poverty in agriculture: Expanding roles for agricultural cooperatives in Malaysia. *Malaysia Journal of Society and Space*, 8(4), 1-11.
- Cialdini, R.B., Reno, R.R., and Kallgren, C.A. (1990). A focus theory of normative conduct: Recycling the concept of norms to reduce littering in public. *Journal of Personality and Social Psychology*, 58(6), 1015-1026.
doi: 0022-3514/90/500.75
- Crespo, A., and del Bosque, I. (2008). The effect of innovativeness on the adoption of B2C e-commerce: A model based on the theory of planned behavior. *Journal of Computers in Human Behavior*, 24, 2830–2847.
doi:10.1016/j.chb.2008.04.008
- Cristoplos, I. (2010). *Mobilizing the potential of agricultural advisory services*. Rome: Office of Knowledge Exchange, Research and Extension, FAO.
- Cronbach, L. J. (1951). Coefficient alpha and the internal structure of tests. *Psychometrika*, 16(3), 297-334.
- Churi, A. J., Mlozi, M. R., Mahoo, H., Tumbo, S. D., and Casmir, R. (2013). A decision support system for enhancing crop productivity of smallholder farmers in semi-arid agriculture. *International Journal of Information*, 3(8).
- Churi, A. J., Mlozi, M. R., Tumbo, S. D., and Casmir, R. (2012). Understanding farmers information communication strategies for managing climate risks in rural semi-arid areas, tanzania. *International Journal of Information*, 2(11).
- Claire Schaffnit-Chatterjee. (2010). *Risk management in agriculture*. Germany: Deutsche Bank Research.
- Csoto, M. (2010). Information flow in agriculture through new channels for improved effectiveness. *Journal of Agricultural Informatics*. 1: 25 – 34.
- Davis, F. D. (1989). Perceived usefulness, perceived ease of use, and user acceptance of information technology. *MIS Quarterly*, 13(3), 319-340.

- Davis, F. D., Bagozzi, R., and Warshaw, P. R. (1989). User acceptance of computer technology: a comparison of two theoretical models. *Management Science*, 35(8), 982-1003.
- Davis, F. D., and Venkatesh, V. (1996). A critical assessment of potential measurement biases in the technology acceptance model: Three experiments. *International Journal of Human Computer Studies*, 45(1), 19-45.
- De Haen, H., and Hemrich, G. (2007). The economics of natural disasters: implications and challenges for food security. *Agricultural Economics*, 37(s1), 31-45.
- Department of Statistics Malaysia (2017). Selected Agriculture indicators. Malaysia: Department of Statistics.
- Department of Statistics Malaysia (2013). Frequency of Internet used by Individuals. Malaysia: Department of Statistics.
- Deressa, T. T., and Hassan, R. M. (2009). Economic impact of climate change on crop production in Ethiopia: evidence from cross-section measures. *J. Afr. Econ.* 18, 529-554.
- Dercon, S., and Christiaensen, L. (2011). Consumption risk, technology adoption and poverty traps: evidence from Ethiopia. *Journal of Development Economics*, 96(2), 159-173. doi:10.1016/j.jdeveco.2010.08.003.
- Dezdar, S. (2017). Green information technology adoption: influencing factors and extension of theory of planned behavior. *Social Responsibility Journal*, 13(2), 292-306.
- Dillon, A., and Morris, M. G. (1996). User acceptance of new information technology: theories and models. In *Annual review of information science and technology*. Medford, NJ: Information Today.
- Dillon, J. L., and Hardaker, J. B. (1993). *Farm Management Research for Small Farmer Development* (2nd ed.). FAO. Rome. Italy.
- Dillon, J. L., and Scandizzo, P. L. (1978). Risk attitudes of subsistence farmers in Northeast Brazil: A sampling approach. *American Journal of Agricultural Economics*, 60(3), 425-435.
- Doss, C. R. (2006). Analyzing technology adoption using microstudies: limitations, challenges, and opportunities for improvement. *Agricultural Economics*, 34(3), 207-219.
- Doss, C. R., and Morris, M. L. (2001). How does gender affect the adoption of agricultural innovations?: The case of improved maize technology in Ghana. *Agricultural Economics*, 25(1), 27-39.

- Douglas, I., Alam, K., Maghenda, M., McDonnell, Y., McLean, L., and Campbell, J. (2008). Unjust waters: climate change, flooding and the urban poor in Africa. *Environment and Urbanization*, 20(1), 187-205.
- Edwards-Jones, G. (2006). Modelling farmer decision-making: concepts, progress and challenges. *Animal Science*, 82, 783-790.
- Efron, R. (1969). What is Perception?. In *Proceedings of the Boston Colloquium for the Philosophy of Science 1966/1968* (pp. 137-173). Springer Netherlands.
- Encarta World English Dictionary. (2007). *Risk*. [Online]. Microsoft Corporation.
- Enjolras, G., Capitano, F., Aubert, M., and Adinolfi, F. (2012). Direct payments, crop insurance and the volatility of farm income. Some evidence in France and in Italy. 123rd Seminar, February 23-24, 2012, Dublin, Ireland, European Association of Agricultural Economists.
- Etta, F. E., and Parvyn-Wamahiu, S. (2003). *Information and communication technologies for development in Africa: the experience with community telecentres*; v. 2. IDRC, Ottawa, ON, CA.
- European Commission. (2001). Communication from the Commission to the Council and the European Parliament. Information and Communication Technologies in Development. The role of ICTs in EC Development Policy, Brussels, [online]. Available: http://europa.eu.int/eur-lex/en/com/cnc/2001/com2001_0770en01.pdf
- FAO. (2000). The role of information and communication technologies in rural development and food security. SD Dimensions. Rome: FAO.
- FAO. (2008). The state of food insecurity in the world 2008. High food prices and food security threats and opportunities. Rome.
- FAO. (2013). *ICT uses for inclusive agricultural value chains*. Rome: Rural Infrastructure and Agro-Industries Division of FAO. <http://www.fao.org/sd/CDdirect/CDre0055.htm>
- Feder, G., Just, R. E., and Zilberman, D. (1985). Adoption of agricultural innovations in developing countries: A survey. *Economic development and cultural change*, 33(2), 255-298.
- Field, A. (2006). *Discovering Statistics Using SPSS* (2nd ed.) London: Sage Publications Ltd.
- Fielding, K. S., Terry, D. J., Masser, B. M., Bordia, P., and Hogg, M. A. (2005). Explaining landholders' decisions about riparian zone management: The role of behavioural, normative, and control beliefs. *Journal of Environmental Management*, 77(1), 12-21.

- Finlay, J. E. (2009). Fertility Response to Natural Disasters: The Case of Three High Mortality Earthquakes. World Bank Policy Research Working Paper 4883.
- Fischhoff, B. (1995) Risk communication and perception unplugged: twenty years of process, *Risk Analysis*, 15, 137-145.
- Fischhoff, B., Slovic, P., Lichtenstein, S., Reads, S., and Combs, B. (1978). How safe is safe enough? A psychometric study of attitudes towards technological risks and benefits, *Policy Science*, 9, 127-152.
- Fishbein, M., and Ajzen, I. (1975). *Belief, attitudes, intention and behavior: An introduction to theory and research*. Reading, MA: Addison-Wesley.
- Fischer, R. A., Byerlee, D., and Edmeades, G. O. (2009). Can technology deliver on the yield challenge to 2050?. In *Expert Meeting on How to feed the World in 2050* (Vol. 2050, pp. 1-48).
- Flaten, O., Lien, G., Koesling, M., Valle, P. S., and Ebbesvik, M. (2005). Comparing risk perceptions and risk management in organic and conventional dairy farming: Empirical results from Norway. *Livestock Production Science*, 95(1-2), 11-25.
- Fleisher, B. (1990). *Agricultural risk management*, Lynne Rienner Publishers Inc., Colorado, USA.
- Foster, A. D., and Rosenzweig, M. R. (1995). Learning by doing and learning from others: Human capital and technical change in agriculture. *Journal of Political Economy*, 1176-1209.
- Foster, A., and Rosenzweig, M. (2010). Microeconomics of Technology Adoption. *Annual Review of Economics*. 2: 395-424.
- Fraisse, C. W., Breuer, N. E., Zierden, D., Bellow, J. G., Paz, J., Cabrera, V. E., Garcia, A., Ingram, K. T., Hatch, U., Hoogenboom, G., Jones, J. W., and O'Brien, J. J. (2006). AgClimate: A climate forecast information system for agricultural risk management in the southeastern USA. *Computers and Electronics in Agriculture* 53(1):13-27.
- Frank, E., Eakin, H., and López-Carr, D. (2011). Social identity, perception and motivation in adaptation to climate risk in the coffee sector of Chiapas, Mexico. *Global Environ. Change* 21(1), 66–76.
- Frankenberg, E., Friedman, J., Gillespie, T., Ingwersen, N., Pynoos, R., Rifai, I. U., ... and Thomas, D. (2008). Mental Health in Sumatra after the Tsunami. *American Journal of Public Health*, 98 (9), 1671-1677.
- Frankhauser, S., Smith, J. B., and Tol, R. S. (1999). Weathering climate change: some simple rules to guide adaptation decisions. *Ecological Economics* 30: 67-78.

- Franzel, S. C., and Scherr, S. J. (Eds.). (2002). *Trees on the farm: assessing the adoption potential of agroforestry practices in Africa*. CABI.
- Freeman, P. K. (2000). Infrastructure, natural disasters, and poverty. *Managing Disaster Risk in Emerging Economies*, 55-61.
- Gakuru, M., Winters, K., and Stepman, F. (2009). Innovative farmer advisory services using ICT. documento presentado en el taller de W3C “Africa perspective on the role of mobile technologies in fostering social development”, Maputo, 1.
- Galt, R. E. (2008). Toward an Integrated understanding of pesticide use intensity in Costa Rican vegetable farming. *Human Ecology* 36, 655–677.
- Gentry, L., and Calantone, R. (2002). A comparison of three models to explain shop-bot use on the web. *Psychology and Marketing*, 19(11), 945–956.
- George, T., Bagazonzya, H., Ballantyne, P., Belden, C., Birner, R., Del Castello, R., and Treinen, S. (2011). *ICT in agriculture: connecting smallholders to knowledge, networks, and institutions*. Washington, DC: World Bank. <http://www.ictinagriculture.org/ictinag/node/105>
- Gould, R. V., and Fernandez, R. M. (1989). Structures of mediation: A formal approach to brokerage in transaction networks. *Sociological Methodology* 19, 89-126.
- Government of Malaysia. (2014). Malaysia’s 5th National Report to CBD. Biodiversity and Forestry Management Division, Ministry of Natural Resources and Environment of Malaysia, p. 10. Retrieved from <http://www.cbd.int/doc/world/my/my-nr-05-en.pdf>
- Government of Malaysia. (2015). 11th Malaysia Plan. The Economic Planning Unit, Prime Minister’s Department. Putrajaya, Malaysia. Retrieved from https://www.talentcorp.com.my/clients/TalentCorp_2016_7A6571AE_D9D0-4175-B35D-99EC514F2D24/contentms/img/publication/RMKE11%20Book.pdf
- Guilford, J. P., and Fruchter, B (1973). *Fundamental statistics in psychology and education*. 6th edition. New York: McGraw Hill.
- Ghadim, A. K. A., Pannell, D. J., and Burton, M. P. (2005). Risk, uncertainty, and learning in adoption of a crop innovation. *Agricultural Economics*, 33(1), 1-9. doi: 10.1111/j.1574-0862.2005.00433.x
- Gitz, V., and Meybeck, A. (2012). Risks, vulnerabilities and resilience in a context of climate change. Building resilience for adaptation to climate change in the agriculture sector, 23, p.19. Proceedings of a joint FAO/OECD workshop.

- Grenade, R. D., Rudow, J., Hermoza, R. T., Aguirre, M. E. A., Scott, C. A., Willems, B., ... and Varady, R. G. (2017). Anticipatory capacity in response to global change across an extreme elevation gradient in the Ica Basin, Peru. *Regional Environmental Change*, 17(3), 789-802.
- Gumede, T., Plauche, M., and Sharma, A. (2008) Evaluating the potential of telephony systems in rural communities: field assessment of project Lwazi of HLT Meraka. Meraka Institute, CSIR.
- Hair, J., R, Anderson, Tatham, R., and Black, W. (1998). *Multivariate Data Analysis* (5th ed.), Englewood Cliffs, NJ: Prentice Hall.
- Halliday, T. (2006). Migration, risk, and liquidity constraints in El Salvador. *Economic Development and Cultural Change* 54 (4), 893-925.
- Hamdan, R., Kari, F., and Othman, A. (2011). Climate variability and socioeconomic vulnerability of aquaculture farmers in Malaysia. In Proceeding of the 2011 International Conference on Business and Economics Research, Singapore (pp. 47-52).
- Hankins, M., French, D., and Horne, R. (2000). Statistical guidelines for studies of the theory of reasoned action and the theory of planned behaviour. *Psychology and Health*, 15(2), 151-161.
- Hanneman, R. A., and Riddle, M. (2005). *Introduction to social network methods*. Riverside, CA: University of California.
- Hansen, J., Hellin, J., Rosenstock, T., Fisher, E., Cairns, J., Stirling, C., ... and Campbell, B. (2018). Climate risk management and rural poverty reduction. *Agricultural Systems*. <https://doi.org/10.1016/j.agsy.2018.01.019>
- Hardaker, J. B., Huirne, R. B. M., and Anderson, J. R. (1997). *Coping with risk in agriculture*, Wallingford, UK: CAB International.
- Hardaker, J. B., Huirne, R. B. M., Anderson, J. R., and Lien, G. (2004). *Coping with risk in agriculture*, Wallingford, UK: Cabi Publishing.
- Hardaker, J. B. (2006). Farm risk management: past, present and prospects. *Journal of Farm Management*, 12 (10): 593-612.
- Harwood, J., Heifner, R., Coble, K., Perry, J., and Somwaru, A. (1999). Managing risk in farming: Concepts, research, and analysis. Market and trade economics division and resource economics division. In *Economic research service, US Department of Agriculture. Agricultural economic report* (Vol. 774, p. 130).

- Hassan, M. S., Hassan, M. A., Samah, B. A., Ismail, N., and Shaffril, H. A. M. (2008). Use of information and communication technology (ICT) among agri-based entrepreneurs in Malaysia. In *Proceedings of the World Conference on Agricultural Information and IT, Atsugi, Japan* (pp. 753-762).
- Hassan, M. A., Hassan, M. S., Shaffril, H. A. M., and D'Silva, J. L. (2009). Problems and obstacles in using information and communication technology (ICT) among Malaysian agro-based entrepreneurs. *European Journal of Scientific Research*, 36(1), 93-101.
- Hassan, M. S., Shaffril, H. A. M., Samah, B. A., Ali, M. S. S., and Ramli, N. S. (2010). Agriculture communication in Malaysia: The current situation. *American Journal of Agricultural and Biological Sciences*, 5(3), 389-396.
- Hassan, M. A., Samah, B. A., Shaffril, H. A. M., and D'Silva, J. L. (2011). Perceived usefulness of ICT usage among JKKK members in Peninsular Malaysia. *Asian Social Science*, 7(10), 255.
- Heeks, R. (2007). e-Africa and m-Africa: how can ICTs deliver? In Africa after the Africa Commission: What priorities for the German G8? http://www.odi.org.uk/events/G8_07/opinions/heeks.pdf
- Herath, G., and Hasanov, A. (2017). Climate Change and Threats to Sustainability in South East Asia: Dynamic Modelling Approach for Malaysia. In *Regional Growth and Sustainable Development in Asia* (pp. 133-148). Springer International Publishing.
- Ho, R. (2006). *Handbook of univariate and multivariate data analysis and interpretation with SPSS*. Boca, Raton, New York: Chapman and Hall/CRC, Taylor and Francis Group.
- Hoang, L. A., Castella, J. C., and Novosad, P. (2006). Social networks and information access: implications for agricultural extension in a rice farming community in northern Vietnam. *Agric. Hum. Values*, 23, 513-527.
- Howden, S. M., Soussana, J. F., Tubiello, F. N., Chhetri, N., Dunlop, M., and Meinke, M. (2007). Adapting agriculture to climate change. *Proc. Natl. Acad. Sci. USA*, 104(50), 19691-19696.
- Hsu, M. H., and Chiu, C. M. (2004). Predicting electronic service continuance with a decomposed theory of planned behaviour. *Behaviour and Information Technology*, 23(5), 359-373.
- Hu, Q., Zillig, L. M. P., Lynne, G. D., Tomkins, A. J., Waltman, W. J., Hayes, M. J., ... and Wilhite, D. A. (2006). Understanding farmers' forecast use from their beliefs, values, social norms, and perceived obstacles. *Journal of Applied Meteorology and Climatology*, 45(9), 1190-1201.

- Huda, A. K. S., Selvaraju, R., Balasubramanian, T. N., Geethalakshmi, V., George, D. A., and Clewett, J. F. (2004). Experiences of using seasonal climate information with farmers in Tamil Nadu, India, In Huda, A. K. S., Packham, R. G., eds. *Using Seasonal Climate Forecasting in Agriculture: a Participatory Decision-making Approach*. Australian Centre for International Agricultural Research, Canberra.
- Hucks, N., Todd, V., Burney, R. B., and Secrest, T. W. (2012). Agricultural risk management in the Northern Coastal Plains of South Carolina. *Journal of Management and Marketing Research*, 9, 1.
- Huirne, R. B. M., Meuwissen. M. P. M., and Van Asseldonk, M. A. P. M. (2007). Importance of Whole-farm Risk Management in Agriculture. In A. Weintraub, C. Romero, T. Bjorndal and R. Epstein. *Handbook of Operations Research in Natural Resources*. US: Springer: 3-15.
- Huq, S., Karim, Z., Asaduzzaman, M., and Mahtab, F. (1999). *Vulnerability and adaptation to climate change in Bangladesh*. Dordrecht: The Netherlands. Kluwer Academic Publishers.
- Ifeanyi-Obi, C. C., Togun, A. O., Lamboll, R., Adesope, O. M., and Arokoyu, S. B. (2017). Challenges faced by cocoyam farmers in adapting to climate change in Southeast Nigeria. *Climate Risk Management*.
- Ilbery, B., Gilg, A., Kneafsey, M., and Little, J. (2005). Relocalisation and alternative food networks: a comparison of two regions. Economic and Social Research Council.
- Indrani, T., Siwar, C., Hossain, M. A., and Vijian, P. (2001). Situation of agriculture in Malaysia-A cause for concern. *Education and Research Association for Consumers Malaysia*.
- International Council for Science (ICSU) Regional Office for Asia and the Pacific (2008). *Science Plan on Hazards and Disasters: Earthquakes, Floods and Landslides*.
- IPCC. (2001). *Climate Change 2001: Impacts, Adaptation, and Vulnerability. Contribution of Working Group II to the Third Assessment Report of the Intergovernmental Panel on Climate Change*, J. J. McCarthy, O. F. Canziani, N. A. Leary, D. J. Dokken and K. S. White, (Eds.), Cambridge University Press, Cambridge.
- IPCC. (2012). *Managing the Risks of Extreme Events and Disasters to Advance Climate Change Adaption*. Report of Intergovernmental Panel on Climate Change Cambridge University Press. Cambridge.

- Iqbal, M. A., Ping, Q., Abid, M., Kazmi, S. M. M., and Rizwan, M. (2016). Assessing risk perceptions and attitude among cotton farmers: A case of Punjab province, Pakistan. *International Journal of Disaster Risk Reduction*, 16, 68-74. doi:10.1016/j.ijdr.2016.01.009
- Isaac, M. E. (2012). Agricultural information exchange and organizational ties: The effect of network topology on managing agrodiversity. *Agric. Syst.*, 109, 9–15.
- Isaac, M. E., Erickson, B. H., Quashie-Sam, S. J., and Timmer, V. R. (2007). Transfer of knowledge on agroforestry management practices: The structure of farmer advice networks. *Ecol. Soc.*, 12, 32.
- Islam, Z., Bagchi, B., and Hossain, M. (2007). Adoption of leaf color chart for nitrogen use efficiency in rice: Impact assessment of a farmer-participatory experiment in West Bengal, India. *Field Crops Research*, 103(1), 70-75.
- Islam, M. A., Bari, M. F., and Noor, M. A. (2017). The impact of ICT on paddy production: study focus on Zinardi union, Palash Thana, Narsingdi district, Dhaka, Bangladesh. *Journal of Agricultural Studies*, 5(2), 116-125.
- Ismail, M. M. (2010). Malaysia towards new agricultural policy: Feeding a high income population. Southeast Asian Council for Food Security and Fair Trade. Retrieved from http://www.seacouncil.org/seacon/index.php?option=com_content&view=article&id=338:malaysia-towards-new-national-agriculture-policy&catid=52:food-security&Itemid=82
- Istikomah, Qurat-ul Ain., and Rahman, A. A. (2015). The transformation of agriculture based economy to an industrial sector through crowd sourcing in Malaysia. *International Journal of Computer Science and Information Technology Research*, 3(1), 34-41.
- Jaffer, S., Siegel, P., and Andrews, C. (2010). Rapid agricultural supply chain risk assessment: A conceptual framework. *Agriculture and rural development discussion paper*, 47. Washington, DC: World Bank. USA.
- Jaffer, S., Siegel, P., and Andrews, C. (2008). Rapid Agricultural Supply Chain Risk Assessment. Commodity Risk Management. Agriculture and Rural Development Department, World Bank.
- Jagtap, S. S., Jones, J. W., Hildebrand, P., Letson, D., O'Brien, J. J., Podestá, G., ... and Zazueta, F. (2002). Responding to stakeholder's demands for climate information: from research to applications in Florida. *Agricultural Systems*, 74(3), 415-430.
- Jain, R., Rani Ahuja, U., and Kumar, A. (2012). ICTs and farm women: Access, use and impact. *Indian Journal of Agricultural Economics*, 67(3), 385.

- Jan, I., Khan, H., and Jalaluddin, M. (2008). Analysis of agricultural extension system: a discrepancy between providers and recipients of the extension services empirical evidence from North-West Pakistan. *Sarhad Journal of Agriculture*, 24(2), 349-354.
- Jere, N. J., and Maharaj, M. S. (2017). Evaluating the influence of information and communications technology on food security. *South African Journal of Information Management*, 19(1), 1-7.
- Jeremy, L., Beghin, B. D., and Pickens, M. (2010) Cellphone banking transforms the unbanked into bankers. Press release. Retrieved from <http://www.finscope.co.za/new/pages/Initiatives/Mobile-Banking.aspx?random>
- Jiriko, R. K., Obianuko, J. C., and Jiriko, K. G. (2015). Socio-economic factors affecting ICT utilization by youths in fish farming in Kaduna state, Nigeria. *Global Journal of Agricultural Research*, 3(4), 12-22.
- Just, R., and Pope, R. (2002). *A comprehensive assessment of the role of risk in U. S. agriculture*. Massachusetts. p. 586.
- Kabir, K. H. (2015). Attitude and Level of Knowledge of Farmers on ICT based Farming. *European Academic Research*, 2(10), 13177-13196.
- Kahan, D. (2013). *Managing Risk in Farming*. FAO.
- Kajfez-Bogataj, L. (2005). Climate change and agriculture vulnerability. *Acta Agriculturae Slovenica*, 85 (1): 25-40
- Kalinda, T. (2014). Multiple shocks and risk management strategies among rural households in Zambia's Mazabuka district. *Journal of Sustainable Development*, 7(5).
- Kalusopa, T. (2005). The challenges of utilizing information and communication technologies (ICTs) for the small scale farmers in Zambia. *Library Hi Tech*, 23 (3), 414-424.
- Karagiorgos, K., Fuchs, S., Kitikidou, K., Maris, F., Paparrizos, S., and Thaler, T. (2016). Assessment of flood risk perceptions and adaptation capacity: a comparative study between rural and peri-urban areas in Greece, Hydrol. *Earth Syst. Sci. Discuss.*, doi:10.5194/hess-2016-298.
- Keshavarz, M., and Karami, E. (2016). Farmers' pro-environmental behavior under drought: Application of protection motivation theory. *Journal of Arid Environments*, 127, 128-136.
- Krone, M., Dannenberg, P., and Nduru, G. (2016). The use of modern information and communication technologies in smallholder agriculture: Examples from Kenya and Tanzania. *Information Development*, 32(5), 1503-1512.

- Karppinen, H. (2005). Forest owners' choice of reforestation method: An application of the theory of planned behavior. *Forest Policy Econ.*, 7 (3): 393-409.
- Khorrarnia, K., Shariff, A. R. M., Rahim, A. A., and Mansor, S. (2014). Toward Malaysian sustainable agriculture in 21st century. In *IOP Conference Series: Earth and Environmental Science*, 18(1). IOP Publishing.
- Kulkarni, A. S., and Sonawane, M. (2017). Role of emerging technology and extension programme in sustainable agricultural development. *Adarsh Journal of Information Technology*, 6(1), 11-16.
- Katona, P., and Katona-Apte, J. (2008). The interaction between nutrition and infection. *Clinical Infectious Diseases*, 46(10). 1582-1588.
- Kienzler, S., Pech, I., Kreibich, H., Müller, M., and Thieken, A. H. (2015). After the extreme flood in 2002: changes in preparedness, response and recovery of flood-affected residents in Germany between 2005 and 2011, *Natural Hazards and Earth System Sciences*, 15, 505-526.
- Kisaka-Lwayo, M., and Obi, A. (2012). Risk perceptions and management strategies by smallholder farmers in KwaZulu-Natal province, South Africa. *International Journal of Agricultural Management* 1(3):28-39.
- Kitonyoh, C. K. (2015). *A farm level analysis of risk attitude, sources and risk measurement strategies among farmers in Trans Nzoia County, Kenya* (Masters dissertation, The Moi University, Kenya). Retrieved from <http://ir.mu.ac.ke:8080/xmlui/handle/123456789/1236>
- Kiiza, B., and Pederson, G. (2012). ICT-based market information and adoption of agricultural seed technologies: Insights from Uganda. *Telecommunications Policy*, 36(4), 253-259.
- Kleinbaum, D.G., Kupper, L.L. and Muller, K.E. (1988). *Applied regression analysis and other multivariate methods*, PWS, Boston, MA.
- Koesling, M., Ebbesvik, M., Lien, G., Flaten, O., Valle, P. S., and Arntzen, H. (2004). Risk and risk management in organic and conventional cash crop farming in Norway. *Food Economics-Acta Agriculturae Scandinavica, Section C*, 1(4), 195-206.
- Kohli, I., and Singh, N. (1989). Exports and growth: critical minimum effort and diminishing returns. *Journal of Development Economics*, 30(2), 391-400.
- Kotler, P. (2000). *Marketing management. analysis, planning, implementation, and control*. 9th Edition. Prentice Hall International, Int, New Jersey.
- Kraus, S. J. (1995). Attitudes and the prediction of behavior: A meta analysis of the empirical literature. *Personality and Social Psychology Bulletin* 21(1):58-75.

- Kreimer, A., and Munasinghe, M. (1990). Managing environmental degradation and natural disasters: an overview. The Division. In *Environment*. Environment and Research Div.
- Krejcie, R. V., and Morgan, D. W. (1970). Determining sample size for research activities. *Educational and Psychological Measurement Journal*, 30(3): 607-610.
- Kumar, R., Hudda, R. S., Chahal, P., and Yadav, K. (2017). Availability of information and communication technologies (ICTs) tools usages by farmers in Haryana. *Int. J. Pure App. Biosci*, 5(3), 648-653.
- Le, T. C., and Cheong, F. (2010). Perceptions of risk and risk management in Vietnamese catfish farming: An empirical study. *Aquaculture Economics and Management*, 14(4): 282-314.
- Legesse, B., and Drake, L. (2005). Determinants of smallholder farmers' perceptions of risk in the Eastern Highlands of Ethiopia. *Journal of Risk Research*, 8(5), 383-416.
- Legg, W., and H. Huang. (2010). Climate change and agriculture. OECD Observer. Retrieved from http://www.oecdobserver.org/news/fullstory.php/aid/3213/Climate_change_and_agriculture.html
- Lekopanye, C. M., and Sundaram, M. K. (2017). An investigation on information communication technology awareness and use in improving livestock farming in Southern District, Botswana. *International Journal of Advanced Computer Science and Applications*, 8(2), 17-23.
- Leppälä, J., Murtonen, M., and Kauranen, I. (2012). Farm risk map: a contextual tool for risk identification and sustainable management on farms. *Risk Management* 14, (1): 42-59.
- Li, M., Dong, Z. Y., and Chen, X. (2012). Factors influencing consumption experience of mobile commerce: A study from experiential view. *Internet Research*, 22(2), 120-141.
- Li, Y., Ye, W., Wang, M., and Yan, X. (2009). Climate change and drought: a risk assessment of crop-yield impacts. *Climate Research*, 39(1), 31-46.
- Lien, G., Flaten, O., Ebbesvik, M., Koesling, M., and Valle, P. S. (2004). Risk and risk management in organic and conventional dairy farming: empirical results from Norway. *Farm Management-Institute of Agricultural Management*, 11, 645-677.
- Lindell, M. K. (2013). Recovery and reconstruction after disaster. In *Encyclopedia of Natural Hazards* (pp. 812-824). Springer Netherlands.

- Lindesmith, A. R., and Strauss, A. L. (1956). *Social Psychology*. Holt Rinehart and Winston, New York: The Dryden Press.
- Litre, G., and Bursztyn, M. (2015). Climatic and socio-economic risks perceptions and adaptation strategies among livestock family farmers in the Pampa Biome. *Ambiente and Sociedade*, 18(3), 55-80.
- Luseno, W. K., McPeak, J. G., Barret, C. B., Little, P. D., and Gebru, G. (2003). Assessing the value of climate forecast information for pastoralists: Evidence from Southern Ethiopia and Kenya. *World Development*. 31(9), 1477-1494.
- Lwoga, E. T., Ngulube, P., and Stilwell, C. (2010). Understanding indigenous knowledge: Bridging the knowledge gap through a knowledge creation model for agricultural development, *SA Journal of Information Management* 12(1). DOI: 10.4102/sajim.v12i1.436.
- Madai, H. (2008). Risk Sources and Risk Management Strategies Applied by the Hungarian Sheep Producers. University of Debrecen: *Fascicula: Ecotoxicologie, zootehnie Si Tehnologii De Industrie Alimentara*.
- Mahaliyanaarachchi, R. P. (2003). *Basics of agricultural extension*. Colombo: Godage International Publishers.
- Mahant, M., Shukla, A., Dixit, S., and Patel, D. (2012). Uses of ICT in agriculture. *Int. J. Advanced Computer Research*, 2(1).
- Malla, G. (2009). Climate change and its impact on Nepalese agriculture. *Journal of Agriculture and Environment*, 9, 62-71.
- Mannetti, L., Pierro, A., and Livi, S. (2002). Explaining consumer conduct: From planned to self-expressive behavior. *Journal of Applied Social Psychology*, 32, 1431-1451.
- Marker, P., Mcnamara, K., and Wallace, L. (2002). The significance of information and communication technologies for reducing poverty. [online]. Available: http://www.oecd.org/dac/ictcd/docs/matrixdocs/GBR_paper1.pdf.
- Maru, A. (2004). ICT/ICM in agricultural research and development: status in Sub-Saharan Africa. A background paper for Forum for Agricultural Research in Africa (FARA)/Regional Agricultural Information System (RAIS) Workshop, Accra, Ghana.
- Mase, A. S., Gramig, B. M., and Prokopy, L. S. (2016). Climate change beliefs, risk perceptions, and adaptation behavior among Midwestern US crop farmers. *Climate Risk Management*, 15, 8-17.

- Masozera, M., Bailey, M., and Kerchner, C. (2007). Distribution of impacts of natural disasters across income groups: A case study of New Orleans. *Ecological Economics*, 63(2), 299-306.
- Masud, M. M., Azam, M. N., Mohiuddin, M., Banna, H., Akhtar, R., Alam, A. F., and Begum, H. (2017). Adaptation barriers and strategies towards climate change: Challenges in the agricultural sector. *Journal of Cleaner Production*, 156, 698-706.
- Mathieson, K. (1991). Predicting user intentions: Comparing the technology acceptance model with the theory of planned behavior. *Information Systems Research*, 2(3), 173-191.
- Matthews, R., and Selman, P. (2006). Landscape as a focus for integrating human and environmental processes. *Journal of Agricultural Economics* 57 (2), 199-212.
- Matuschke, I. (2008). Evaluating the Impact of Social Networks in Rural Innovation Systems: An Overview; International Food Policy Research Institute: Washington, DC, USA, Volume 816.
- May, J., Karugia, J., and Ndokweni, M. (2007). ICT and agricultural development: transformation and employment generation. Final framework paper for the African Economic Research Consortium (AERC).
- McGregor, M. J., Willock, J., Dent, J. B., Deary, I., Sutherland, A. S., Morgan, O., and Grieve, R. (1996). Links between psychological factors and farmer decision making. *Farm Management*.
- McGregor, M. J., Rola-Rubzen, M. F., and Murray-Prior, R. (2001). Micro and macro-level approaches to modelling decision making. *Agricultural Systems* 69, 63–83.
- McNew, K. P., Mapp, H. P., Duchon, C. E., and Merritt, E. S. (1991). Sources and uses of weather information for agricultural decision makers. *Bulletin of the American Meteorological Society*, 72(4), 491-498.
- Meera, S. N. (2003). *A critical analysis of information technology in agricultural development: impact and implications* (Doctoral dissertation, The Indian Agricultural Research Institute (IARI), New Delhi, India). Retrieved from krishikosh.egranth.ac.in/bitstream/1/5810008149/1/IARI-7102.pdf
- Meera, S. N., Jhamtani, A., and Rao, D. U. M. (2004). Information and communication technology in agricultural development: a comparative analysis of three projects from India. AgRen Network Paper No.135, ODI.
- Meinke, H., Nelson, R., Kokic, P., Stone, R., Selvaraju, R., and Baethgen, W. (2006). Actionable climate knowledge: from analysis to synthesis. *Clim. Res.*, 33: 101-110.

- Melyukhina, O. (2011). Risk management in agriculture in the Netherlands. OECD Food, Agriculture and Fisheries Working Papers, No. 41, OECD Publishing. <http://dx.doi.org/10.1787/5kgj0d5lqn48-en>
- Menapace, L., Colson, G., Raffaelli, R. (2015). Climate change beliefs and perceptions of agricultural risks: an application of the exchangeability method. *Glob. Environ. Chang.* 35, 70-81. <http://dx.doi.org/10.1016/j.gloenvcha.2015.07.005>.
- Meuwissen, M. P., Huirne, R. B. M., and Hardaker, J. B. (2001). Risk and risk management: an empirical analysis of Dutch livestock farmers. *Livestock Production Science*, 69(1), 43-53.
- Meuwissen, M. P., Huirne, R. B., and Hardaker, J. B. (1999). Perceptions of Risks and Risk Management Strategies: An Analysis of Dutch Livestock Farmers. In *AAEA Annual Meeting, August* (pp. 8-11), Nashville, Tennessee.
- Milovanovic, S. (2014). The role and potential of information technology in agricultural improvement. *Ekonomika Poljoprivrede*, 61(2), 471.
- Miranda, M. J., and Glauber, J. W. (1997). Systemic risk, reinsurance, and the failure of crop insurance markets. *American Journal of Agricultural Economics*, 79(1), 206-215.
- Mittal, S. (2012). *Modern ICT for agricultural development and risk management in smallholder agriculture in India*. Socioeconomics Working Paper 3. Mexico, D. F.: CIMMYT.
- Mittal, S., and Mehar, M. (2013). *Agricultural information networks, information needs and risk management strategies: a survey of farmers in Indo-Gangetic plains of India*. Socioeconomics Working Paper 10. Mexico, D. F: CIMMYT.
- Mody, B. (1995). State consolidation through liberalization of telecommunications services in India. *Journal of Communication*. 45 (4), 107-124.
- Moghaddam, B. K., and Khatoon-Abadi, A. (2013). Factors affecting ICT adoption among rural users: A case study of ICT Center in Iran. *Telecommunications Policy*, 37(11), 1083-1094.
- Montano, D. M., Kasprzyk, D., and Taplin, S. (1997). The theory of reasoned action and the theory of planned behaviour. In: Glanz, K., Lewis, F. M., Rimer, B. K. (Eds.), *Health Behavior and Health Education: Theory Research and Practice*. Jossey-Bass, San Francisco, pp. 85–112.
- Moon, S. J., Miah, M. A. M., and Berg, T. (2016). Farmer's awareness on effective delivery of farm information through ICT mediated extension service in Bangladesh. *European Scientific Journal*, ESJ, 12(21).

- Moore, C., and Benbasat, I. (2001). Development of an instrument to measure the perception of adopting an information technology innovation. *Information Systems Research*, 2(3), 192-222.
- Morwani, D. N., Ombati, J. M., and Ngesa, F. U. (2017). Relationship between level of education of farmers and use of information and communication technologies in marketing of farm produce by small scale farmers in Manga Sub-County, Kenya. *International Journal of Scientific and Technology Research*, 6(2), 257-264.
- Mudombi, S. (2014). *Analyzing the contribution of icts in addressing climate change amongst communal farmers from two districts of Zimbabwe* (Doctoral dissertation, The University of South Africa, South Africa). Retrieved from <http://uir.unisa.ac.za/handle/10500/14668>.
- Muhammad, M., Idris, K., Samah, B. A., Shaffril, H. A. M., Suandi, T., and Ariffin, E. H. (2016). The impact of climate change on small-scale fisherman in Malaysia. *The Social Sciences*, 11 (13): 3352-3356.
- Muijs, D. (2004). *Doing Quantitative Research in Education with SPSS*. London. Thousand Oaks. New Delhi: Sage Publications.
- Muriithi, A. G., Eric, B., and Sarah, O. (2009). Information technology for agriculture and rural development in Africa: Experiences from Kenya. Paper presented at the conference on International research on Food Security, Natural Resources Management and Rural development, Tropentag: University of Hamburg. <http://ir-library.ku.ac.ke/handle/123456789/5584>
- Mustafa, K. (2007). Climate change – Its effects on the agricultural sector in Malaysia. Paper presented at National Seminar on Socio-Economic Impact of Extreme Weather and Climate Change, organized by the Ministry of Science, Technology and Innovation, Putrajaya, Malaysia. 21–22 June.
- Mutlu, M. H. (2017). Unified theory of acceptance and use of technology: The adoption of mobile messaging application. *Megatrend Revija*, 14(1), 169-186.
- Nakasone, E., Torero, M., and Minten, B. (2014). The power of information: The ICT revolution in agricultural development. *Annu. Rev. Resour. Econ.*, 6(1), 533-550.
- NDMA. (2007). National Disaster Risk Management Framework Pakistan, National Disaster Management Authority, Government of Pakistan. Islamabad, Pakistan.
- Naylor, R., and Courtney, P. (2014). Exploring the social context of risk perception and behaviour: Farmers' response to bovine tuberculosis. *Geoforum*, 57, 48-56.

- Nelson, G. C., Rosegrant, M. W., Koo, J., Robertson, R., Sulser, T., and Zhu, C. (2009). *Climate change: Impact on Agriculture and Costs of Adaptation*. Food Policy Report. International Food Policy Research Institute (IFPRI). Washington D.C. USA.
- Neuman, W. L. (2007). *Basics of Social Research Qualitative and Quantitative Approaches*. USA: Pearson Education, Inc.
- Neumayer, E., and Plumper, T. (2007). The gendered nature of natural disasters: The impact of catastrophic events on the gender gap in life expectancy, 1981-2002. *Annals of the Association of American Geographers*, 97 (3), 551-566.
- Newbery, D. M. G., and Stiglitz, J. E. (1981). *The theory of commodity price stabilization: a study in the economics of risk*. New York: Oxford University Press.
- Nchise, A. C. (2012). An empirical analysis of the theory of planned behavior: A review of its application on e-democracy adoption using the partial least squares algorithm. *JeDEM-eJournal of eDemocracy and Open Government*, 4(2), 171-182.
- Ngassam, E. K., Ntawanga, F., and Eloff, J. H. (2013). A roadmap for rural area ICT solution deployment: A Case of Kgautswane community in South Africa. *The African Journal of Information Systems*.
- Ngigi, S. N. (2009). *Climate Change Adaptation Strategies: Water Resources Management Options for Smallholder Farming Systems in Sub-Saharan Africa*. New York: The MDG Centre, East and Southern Africa, The Earth Institute at Columbia University.
- Nonaka, I. (1994). A dynamic theory of organizational knowledge creation. *Organization Science*, 5(1), 14-37.
- Nor Iadah, Y., Shafiz, A. M. Y., Zahurin, M. A., Huda, H. I., Khairudin, M. K., and Zulkhairi, M. D. (2010). The influence of community characteristics towards telecentres success. *Computer and Information Science*, 3(2), 116.
- Norizan, A. R., and Jalaluddin, A. M. (2008). Bridging digital divide in Malaysia: Cyber learning for the marginalized community. In *Distance Learning and the Internet Conference* (pp. 19-22).
- Nzozzo, D., and Mogambi, H (2016). An analysis of communication and information communication technologies adoption in irrigated rice production in Kenya. *International Journal of Education and Research*, 4(12). 295-316.
- O'Connor, R. E., Bord, R. J., and Fisher, A. (1999). Risk perceptions, general environmental beliefs, and willingness to address climate change. *Risk Anal.*, 17, 43-54.

- OECD. (2012). *Farmer Behaviour, Agricultural Management and Climate Change*, OECD Publishing. <http://dx.doi.org/10.1787/9789264167650-en>
- OECD. (2000). *Income Risk Management in Agriculture*. OECD Publications.
- OECD. (2009). *Managing Risk in Agriculture: A Holistic Approach*. Organization for Economic Co-operation and Development. Paris.
- Ogurtsov, V.A., Van Asseldonk, M. P. A. M., and Huirne, R. B. M. (2008). Assessing and modeling catastrophic risk perceptions and attitudes in agriculture: a review. *NJAS-Wageningen Journal of Life Sciences*, 56 (1), 39-58.
- Öhlmér, B., Olson, K., and Brehmer, B. (1998). Understanding farmers' decisionmaking processes and improving managerial assistance. *Agricultural Economics* 18, 273-290.
- Olajide, B. R. (2011). Assessment of farmers' access to agricultural information on selected food crops in Iddo District of Oyo State, Nigeria. *Journal of Agricultural and Food Information*. 12(3-4), 354-363.
- Olaniyi, O. A. (2013). Assessment of utilization of Information and Communication Technologies (ICTs) among poultry farmers in Nigeria: an emerging challenge. *Transnational Journal of Science and Technology*, 3(6), 11-15.
- Olarinde, L. O., Manyong, V. M., and Akintola, J. O. (2010). Factors influencing risk aversion among maize farmers in the Northern Guinea Savanna of Nigeria: Implications for sustainable crop development programmes. *Journal of Food, Agriculture and Environment*, 8(1), 128-134.
- Olivier, J. G., Peters, J. A., and Janssens-Maenhout, G. (2012). *Trends in Global CO₂ Emissions: Report*. PBL Netherlands Environmental Assessment Agency, The Hague.
- Ombogoh, D. B., Tanui, J., McMullin, S., Muriuki, J., and Mowo, J. (2016). Enhancing adaptation to climate variability in the East African highlands: a case for fostering collective action among smallholder farmers in Kenya and Uganda. *Climate and Development*, 1-12.
- Osahr, H., Twyman, C., Adger, W. N., and Thomas, D. S. (2010). Evaluating successful livelihood adaptation to climate variability and change in southern Africa. *Ecology and Society*, 15(2), 27.
- Otero, R. C., and Marti, R. Z. (1995). The impacts of natural disasters on developing economies: implications for the international development and disaster community. *Disaster Prevention for Sustainable Development: Economic and Policy Issues*. Washington DC, World Bank, 11-40.

- Ozor, N. (2010). A comparative analysis of the alternative approaches in the provision of agricultural extension service. *Journal of Agricultural Extension*, 14(1).
- Pandey, S., Barah, B. C., Villano, R. A., and Pal, S. (2000). Risk analysis and management in rainfed rice systems. Limited proceedings of the NCAP/IRRI workshop on risk analysis and management in rainfed rice systems, 21-23 September 1998, National centre for Agricultural economics and policy Research, New delhi, india. Los Banos (Philippines): International Rice Research Institute. 196 p.
- Palinkas, P., and Székely, C. (2008). Farmers' perception on risk and crisis management. In: Meuwissen, M. P. M., M. A. P. M. van Asseldonk and R. B. M. Huirne, *Income Stabilization in European Agriculture: Design and Economic Impact of Risk Management Tools*, Wageningen. Netherlands: Wageningen Academic Publishers,
- Pamuk, H., Bulte, E ., and Adekunle, A. A. (2013). Do decentralized innovation systems promote agricultural technology adoption? Experimental evidence from Africa. *Food Policy* 44, pp. 227-236.
- Pandey, R., Kumar, P., Archie, K. M., Gupta, A. K., Joshi, P. K., Valente, D., and Petrosillo, I. (2018). Climate change adaptation in the western-Himalayas: Household level perspectives on impacts and barriers. *Ecological Indicators*, 84, 27-37.
- Park, N., and Yang, A. (2012). Online environmental community members' intention to participate in environmental activities: An application of the theory of planned behavior in the Chinese context. *Computers in Human Behavior*, 28(4), 1298-1306.
- Parker, J. S., Wilson, R. S., LeJeune, J. T., and Doohan, D. (2012). Including growers in the food safety conversation: Enhancing the design and implementation of food safety programming based on farm and marketing needs of fresh fruit and vegetable producers. *Agriculture and Human Values* 29(3): 303-319.
- Paxson, C., and Rouse, C. E. (2008). Returning to New Orleans after Hurricane Katrina. *The American Economic Review*, 98 (2), 38-42.
- Pavlou, P. A., and Fygenon, M. (2006). Understanding and predicting electronic commerce adoption: An extension of the theory of planned behavior. *Management Information Systems Quarterly*, 115–143.
- Pedersen, P. E. (2001). Adoption of mobile commerce: An exploratory analysis. *SNF-Report 51/01*. Bergen, Norway, Institute for Research in Economics and Business.

- Pedersen, P. E. (2002). The adoption of messaging services among Norwegian teens: development and test of an extended adoption model. *SNF-Report 23/02*. Bergen, Norway, Institute for Research in Economics and Business.
- Pedersen, P. E. (2005). Adoption of mobile internet services: an exploratory study of mobile commerce early adopters. *Journal of Organizational Computing and Electronic Commerce*, 15(3), 203-221.
- Pelling, M. (2003). *The vulnerability of cities: natural disasters and social resilience*. Earthscan.
- Pennings, J. M. E., Wansink, B., and Meulenberg, M. T. G. (2002). A note on modeling consumer reactions to a crisis: the case of the mad cow disease. *International Journal of Research in Marketing*.
- Perugini, M., and Bagozzi, R. P. (2001). The role of desires and anticipated emotions in goal-directed behaviours: Broadening and deepening the theory of planned behavior. *British Journal of Social Psychology*, 40, 79–98.
- Pickernell, D. G., Christie, M. J., Rowe, P. A., Thomas, B. C., Putterill, L. G., and Griffith, J. L. (2004). Farmers market in Wales. Making the ‘network? *J. British Food*, 106, 194-210. <http://dx.doi.org/10.1108/00070700410528781>
- Pike, T. (2008). Understanding Behaviours in a Farming Context. Defra Agricultural Change and Environment Observatory Discussion Paper.
- Pino González-Riancho, P., Gerkenmeier, B., Ratter, B. M. W., González, M., and Medina, R. (2015). Storm surge risk perception and resilience: A pilot study in the German north sea coast. *Ocean and Coastal Management*, 112, 35 44-60.
- Plapp, T., and Werner, U. (2006). Understanding risk perception from natural hazards: examples from Germany, *Risk Analysis*, 21, 101–108.
- Portner, C. C. (2008). Gone with the Wind? Hurricane Risk, Fertility and Education. Working Paper.
- Pretty, J. (2003). Social capital and the collective management of resources. *Science*, 302, 1912-1915.
- Ragasa, C., Berhane, G., Tadesse, F., and Taffesse, A. S. (2013). Gender differences in access to extension services and agricultural productivity. *The Journal of Agricultural Education and Extension*, 19(5), 437-468.
- Rajalahti, R. (2012). Sourcebook overview and user guide. In: *Agricultural innovation systems: An investment handbook*. Washington, D. C.: World Bank.

- Rammel, C., Hinterberger, F., and Bechtold, U. (2004). Governing sustainable development. A co-evolutionary perspective on transitions and change. GOSD Working Paper No.1. Institute of Anthropology, University of Vienna, Vienna.
- Rammel, C., Stagl, S., and Wilfing, H. (2007). Managing complex adaptive systems- a coevolutionary perspective on natural resource management. *Ecological Economics* 63, 9-21.
- Rao, I. S., and Meera, S. N. (2017). Integration of ICTs in agricultural extension: possible strategies. *Journal of Community Mobilization and Sustainable Development*, 12(1), 129-135.
- Rao, K. N., and Bockel, L. (2008). *Risk management as a pillar in agriculture and food security: India case study*. Policy brief. FAO. Rome, Italy.
- Rashid, S. M. R. A., and Hassan, F. (2012). Information and communications technology development products towards strengthening rural communities in Malaysia. *Canadian Social Science*, 8(5), 91-98.
- Rehman, T., McKemey, K., Yates, C. M., Cooke, R. J., Garforth, C. J., Tranter, R. B., ... and Dorward, P. T. (2007). Identifying and understanding factors influencing the uptake of new technologies on dairy farms in SW England using the theory of reasoned action. *Agricultural Systems*, 94(2), 281-293.
- Renn, O. (1998). The role of risk communication and public dialogue for improving risk management. *Risk Decision and Policy*, 3, 5-30.
- Richardson, D. (1997). *The Internet and rural and agricultural development—an integrated approach*. Rome.
- Richardson, D. (2006). ICTs-transforming agricultural extension? Report of the 6th Consultative Expert Meeting of CTA's Observatory on ICTs. CTA Working Document no. 8034. Wageningen: Technical Centre for Agricultural and Rural Cooperation (CTA). http://www.anancy.net/uploads/file_en/WD8034.pdf
- Richardson, D., Ranirez, R., and Haq, M. (2000). Grameen Telecom's village phone programme in rural Bangladesh: a multi-media case study final report. Consultado el, 21.
- Ritter, T. E. (2012). *Exploring the relationship between risk perception and farmer nutrient management decisions* (Doctoral dissertation, The Ohio State University, Ohio, USA). Retrieved from rave.ohiolink.edu/etdc/view?acc_num=osu1343243182.
- Rivera, W. M., and Qamar, M. K. (2003). *Agricultural Extension, Rural Development and the Food Security Challenge*. FAO. Rome.
- Rogers, E. M. (1995). *Diffusion of innovations*. (4th ed.) New York, NY: Free Press.

- Rogers, E. (2003). *Diffusion of Innovations*. New York, NY: Free Press.
- Rohila, A. K., Yadav, K., and Ghanghas, B. S. (2017). Role of Information and communication technology (ICT) in agriculture and extension. *Journal of Applied and Natural Science*, 9(2), 1097-1100.
- Rohrmann, B. (1998). The risk notion: Epistemological and empirical considerations. In M. G. Steward and R. E. Melchers (Eds.). *Integrated risk assessment: Applications and regulations* (pp. 39-46). Rotterdam: Balkama.
- Roncoli, C., K. Ingram, and Kirshen, P. (2001). The costs and risks of coping with drought: livelihood impacts and farmers' responses in Burkina Faso. *Climate Research* 19 (2): 119–132.
- Roncoli, M. C., Ingram, K. T., Jost, C. C., Kirshen, P. H., and Yaka, P. (2002). Farmers' behavioral responses to seasonal rainfall forecasts in the Sahel-Sudan. In 17th Symposium of the international farming systems association.
- Saeri, A. K., Ogilvie, C., La Macchia, S. T., Smith, J. R., and Louis, W. R. (2014). Predicting facebook users' online privacy protection: Risk, trust, norm focus theory, and the theory of planned behavior. *The Journal of Social Psychology*, 154(4), 352-369.
- Salahudin, S. N., Abdullah, M. M., Newaz, N. Z. (2013). Emissions: sources, policies and development in Malaysia. *International Journal of Education and Research*. 1(7): 1–12.
- Samsuddin, S. F., Omar, S. Z., Samah, B. A., and Bolong, J. (2016). Potential benefits of ICT towards rural positive youth development in Malaysia. *International Journal of Academic Research in Business and Social Sciences*, 6(5), 258-272.
- Sanusi, M. A., Petu-Ibikunle, A. M., and Mohelia, C. M. (2010). The influence of ICT on the dissemination of agricultural information among urban farmers in Northern Guinea Savannah zone of Nigeria. *African Scientist*, 11(2), 135-140.
- Saqib, S. E., Ahmad, M. M., and Panezai, S. (2016). Factors Affecting the Risk Attitude of Farmers in Flood Risk Prone Areas of Khyber Pakhtunkhwa: The Case of Mardan District, Pakistan. International Conference on Disaster Management: From Polar Region to the Local Communities Social and Environmental Development National Institute of Development Administration (NIDA).
- Sartore, G. M., Kelly, B., and Stain, H. J. (2007). Drought and its effect on mental health: How GPs can help. *Australian Family Physician*, 36(12), 990.
- Sartore, G. M., Kelly, B., Stain, H., Albrecht, G., and Higginbotham, N. (2008). Control, uncertainty, and expectations for the future: a qualitative study of the

impact of drought on a rural Australian community. *Rural and Remote Health*, 8(3), 950.

Saxena, A. K. (2009). Greenhouse Gas Emissions: Estimation and Reduction. Asian Productivity Organization, India.

Scolobig, A., De Marchi, B., and Borga, M. (2012). The missing link between flood risk awareness and preparedness: Findings from case studies in an Alpine region, *Natural Hazards*, 63, 499-520.

Schulze, R., and Wittmann, W. W. (2003). On the moderating effect of the principle of compatibility and multidimensionality of beliefs: A meta-analysis of the theory of reasoned action and the theory of planned behavior. In R. Schulze, H. Holling and D. Bohning (Eds.), *Meta-Analysis: New developments and applications in medical and social science* (pp. 219-250). Seattle, WA: Hogrefe and Huber.

Selvaraju, R., Gommers, R., and Bernardi, M. (2011). Climate science in support of sustainable agriculture and food security. *Clim Res.*, 47: 95–110.

Selvaraju, R. (2012). Climate risk assessment and management in agriculture. Building resilience for adaptation to climate change in the agriculture sector, 23, 71.

Selvaraju, R., Meinke, H., and Hansen, J. (2004). Approaches allowing smallholder farmers in India to benefit from seasonal climate forecasting. "New directions for a diverse planet". Proceedings of the 4th International Crop Science Congress, 26 September–1 October 2004, Brisbane, Australia. Published on CDROM (available at www.cropscience.org.au).

Selwyn, N. (2002). *Defining the 'digital divide': developing a theoretical understanding of inequalities in the information age* (Occasional Paper 49). Cardiff: Cardiff University.

Shaari, M. S. M., Karim, M. Z. A., and Basri, B. H. (2016). Flood disaster and GDP growth in Malaysia. *European Journal of Business and Social Sciences*, 4(10), 27-40.

Shaari, M. S. M., Karim, M. Z. A., and Hasan-Basri, B. (2017). Does flood disaster lessen gdp growth? evidence from Malaysia's manufacturing and agricultural sectors. *Malaysian Journal of Economic Studies*, 54(1), 61.

Shaffril, H. A. M., Samah, B. A., Uli, J., and D'Silva, J. L. (2011). The potential impact of climate change environmental hazards on quality of life of fishermen community in Malaysia. *Australian Journal of Basic and Applied Sciences*, 5(7), 507-515.

- Shaffril, H. A., Omar, S. Z., Hassan, M. A., Bolong, J., and Silva, J. L. (2012). Measuring ICT usage among west coast fishermen: Pre-test results from Port Dickson, Negeri Sembilan. *American Journal of Agricultural and Biological Science*.
- Shaluf, I. M., and Ahmadun, F. L. R. (2006). Disaster types in Malaysia: an overview. *Disaster Prevention and Management: An International Journal*, 15(2), 286-298.
- Sharifzadeh, M., Zamani, G. H., Khalili, D., and Karami, E. (2012). Agricultural climate information use: an application of the planned behaviour theory. *Journal of Agricultural Science and Technology*, 14(3), 479-492.
- Sharp, J. S., and Smith, M. B. (2003). Social capital and farming at the rural-urban interface: the importance of non-farmer and farmer relations. *Agricultural Systems* 76, 913-927.
- Sheppard, B. H., Hartwick, J., and Warshaw, P. R. (1988). The theory of reasoned action: A meta analysis of past research with recommendations for modification and future research. *Journal of Consumer Research*, 15(3), 325-343.
- Sherrington, C., Bartley, J., and Moran, D. (2008). Farm-level constraints on the domestic supply of perennial energy crops in the United Kingdom. *Energy Policy*, 36, 2504-2512.
- Siegrist, M., and Gutscher, H. (2008). Natural hazards and motivation for mitigation behavior: People cannot predict the affect evoked by a severe flood, *Risk Analysis*, 28, 771-778.
- Singh, C., Daron, J., Bazaz, A., Ziervogel, G., Spear, D., Krishnaswamy, J., ... and Kituyi, E. (2017). The utility of weather and climate information for adaptation decision-making: current uses and future prospects in Africa and India. *Climate and Development*, 1-17.
- Singh, I., and Grover, J. (2013). Role of extension agencies in climate change related adaptation strategies. *International Journal of Farm Sciences*, 3(1), 144-155.
- Srinuan, C. (2016). ICT adoption by southern Thai rubber plantation smallholders. *International Journal of Applied Business and Economic Research*, 14, 9421-9440.
- Sivakumar, M. V. (2005). Impacts of natural disasters in agriculture, rangeland and forestry: an overview. In: *Natural disasters and extreme events in agriculture* (pp. 1-22). Springer Berlin Heidelberg.

- Siwar, C., Alam, M. M., Murad, M. W., and Al-Amin, A. Q. (2009). A review of the linkages between climate change, agricultural sustainability and poverty in Malaysia. *International Review of Business Research Papers*, 5(6), 309-321.
- Sjöberg, L. (1980). The risks of risk analysis. *Acta Psychologica* 45:301-321.
- Sjöberg, L. (1999). Risk perception in western Europe. *Ambio* 28(6), 543-549.
- Sjöberg, L. (2003). Risk perception och attityder. *The Journal of the Swedish Economic Society* 31(6):22-31.
- Sjöberg, L., Moen, B. E., and Rundmo, T. (2004). *Explaining risk perception. An evaluation of the psychometric paradigm in risk perception research*. Trondheim, Norway: Norwegian University of Science and Technology.
- Skoufias, E. (2003). Economic crises and natural disasters: Coping strategies and policy implications. *World Development*, 31(7), 1087-1102.
- Slovic, P. (1987). Perception of risk. *Science*, 236 (4799), 280-285.
- Slovic, P. (2000). *The perception of risk*, Sterling, London: Earthscan Publications.
- Senkondo, E. M. M. (2000). *Risk attitude and risk perception in agroforestry decisions: the case of Babati Tanzania* (Doctoral dissertation, Wageningen Agricultural University, Wageningen. Netherlands).
- Smidts, A. (1990). *Decision making under risk. A study of models and measurement procedures with special reference to the farmer's marketing behavior* (Doctoral dissertation, Wageningen Agricultural University, Wageningen. Netherlands).
- Soane, E., Schubert, I., Challenor, P., Lunn, R., Narendran, S., and Pollard, S. (2010). Flood perception and mitigation: The role of severity, agency, and experience in the purchase of flood protection, and the communication of flood information, *Environment and Planning* , 42, 3023-3038.
- Sparks, P., Guthrie, C.A., and Shepherd, R. (1997). The dimensional structure of the perceived behavioural construct. *Journal of Applied Social Psychology* 27 (5), 418-438.
- Spielman, D. J., Davis, K., Negash, M., and Ayele, G. (2011). Rural innovation systems and networks: findings from a study of Ethiopian smallholders. *Agriculture and Human Values*, 28(2), 195-212.
- Stringfellow, R., Coulter, J., Hussain, A, Lucey, T., and McKone, C. (1997). Improving the access of smallholders to agricultural services in sub-Saharan Africa. *Small Enterprise Development*, 8 (3), 35-41.

- Sudduth, K. A. (2007). Current status and future directions of precision agriculture in the USA. In *Proceedings of the 2nd Asian Conference on Precision Agriculture* (pp. 2-4).
- Sulaiman, A. H. (2007). Flood and drought management in Malaysia. Paper presented at National Seminar on Socio-Economic Impact of Extreme Weather and Climate Change organized by the Ministry of Science, Technology and Innovation, 21–22 June. Putrajaya, Malaysia.
- Sulaiman, R., and Hall, A. (2006). Extension policy analysis in Asian nations: In A. Van den Ban and R. K. Samanta. *Changing Roles of Agricultural Extension in Asian Nations*. B. R. Publishing, Delhi. pp 23-54.
- Sulewski, P., and Kłoczko-Gajewska, A. (2014). Farmers' risk perception, risk aversion and strategies to cope with production risk: an empirical study from Poland. *Studies in Agricultural Economics*, 116(3), 140-147.
- Šūmane, S., Kunda, I., Knickel, K., Strauss, A., Tisenkopfs, T., des Ios Rios, I., ... and Ashkenazy, A. (2017). Local and farmers' knowledge matters! How integrating informal and formal knowledge enhances sustainable and resilient agriculture. *Journal of Rural Studies*.
- Svendson, G. B., Johnsen, J. A. K., Almås-Sørensen, L., and Vittersø, J. (2013). Personality and technology acceptance: the influence of personality factors on the core constructs of the technology acceptance model. *Behaviour and Information Technology*, 32(4), 323-334.
- Swanson, B. E. (2008). *Global review of good agricultural extension and advisory service practices*. Rome, Italy: Food and Agricultural Organizations (FAO).
- Swanson, B. E., and Samy, M. M. (2002). Developing an extension partnership among public, private, and nongovernmental organizations. *Journal of International Agricultural and Extension Education*, 9(1), 5-10.
- Syal, S. S., Wilson, R. S., Mac Crawford, J., and Lutz, J. (2011). Climate change and human health-what influences the adoption of adaptation programming in the United States public health system? *Mitig. Adapt. Strat. Glob. Change* 16 (8), 911-924.
- Syiem, R., and Raj, S. (2015). Access and usage of icts for agriculture and rural development by the tribal farmers in Meghalaya State of North East India. *Journal of Agricultural Informatics*, 6(3), 24-41.
- Tahir, Z., Malek, J. A., and Ibrahim, M. A. (2016). Developing smart ICT in rural communities in Malaysia through the establishment of telecenters. *e-Bangi*, 11(1).

- Takenaka, S. (2006). Foreword. Enhancement of extension systems in agriculture. Report of the APO Seminar on Enhancement of Extension Systems in Agriculture. Faisalabad, Pakistan, 15-20 December, 2003.
- Taragola, N. and Lierde, D.V. (2005). Adoption of ICT in horticulture: Confronting scientists' opinions with practice in Flanders, Belgium. In *Proc. 6th EFITA Conference, Glasgow, UK*.
- Taylor, S., and Todd, P. (1995a). Assessing IT usage: The role of prior experience. *MIS Quarterly*, 19(4), 561-570.
- Taylor, S., and Todd, P. (1995b). Understanding information technology usage: A test of competing models. *Information Systems Research*, 6(2), 144-176.
- Tiraieyari, N., and Uli, J. (2011). Sustainable agriculture in Malaysia: Implication for extension workers. *Journal of American Science*, 7(8), 179-182.
- Tiraieyari, N., Hamzah, A., and Samah, B. A. (2014). Extension agents and sustainable cocoa farming: A case study of extension agents in Sabah state, Malaysia. *Modern Applied Science*, 8(6), 210.
- TMA (2008). Dekadal Weather Review. Tanzania Meteorological Agency. Dar es Salaam, Tanzania, 2pp.
- Toborn, J., and Harvesting, R. W. (2011). Adoption of agricultural innovations, converging narratives, and the role of Swedish agricultural research for development. *Draft Discussion Paper*.
- Torero, M., and Braun, J. (2006). Information and communication technologies for development and poverty reduction: The potential of telecommunication. The Johns Hopkins University Press and IFPRI.
- Tripathi, A., and Mishra, A. K. (2017). Knowledge and passive adaptation to climate change: An example from Indian farmers. *Climate Risk Management*, 16, 195-207.
- Tun Oo, A., Van Huylenbroeck, G., and Speelman, S. (2017). Determining factors for the application of climate change adaptation strategies among farmers in Magwe District, dry zone region of Myanmar. *International Journal of Climate Change Strategies and Management*, 9(1), 36-55.
- Twigg, J. (2004). Good practice review: Disaster risk reduction, mitigation and preparedness in development and emergency programming. London: Overseas Development Institute (ODI).
- Uaiene, R. N., Arndt, C., and Masters, W. A. (2009). Determinants of agricultural technology adoption in Mozambique. *Discussion papers*, 67.

- Udry, C., and Conley, T. (2004). *Social Networks in Ghana*; Yale University Economic Growth Center Discussion Paper (888): New Haven, CT, USA.
- Uematsu, H., and Mishra, A. K. (2011). A Categorical Data Analysis on Risks in Agriculture. In *Southern Agricultural Economics Association 2011 Annual Meeting*.
- Ullah, R. (2014). *Production risk management and its impacts at the farm level: the case of Pakistan* (Doctoral dissertation, The Asian Institute of Technology, Thailand).
- Ullah, R., Jourdain, D., Shivakoti, G. P., and Dhakal, S. (2015a). Managing catastrophic risks in agriculture: Simultaneous adoption of diversification and precautionary savings. *International Journal of Disaster Risk Reduction*, 12, 268-277. doi: 10.1016/j.ijdr.2015.02.001
- Ullah, R., Shivakoti, G. P., and Ali, G. (2015b). Factors effecting farmers' risk attitude and risk perceptions: The case of Khyber Pakhtunkhwa, Pakistan. *International Journal of Disaster Risk Reduction*, 13, 151-157. doi: 10.1016/j.ijdr.2015.05.005
- Ullah, R., Shivakoti, G. P., Rehman, M., and Kamran, M. A. (2015c). Catastrophic Risks Management at Farm: The Use of Diversification, Precautionary Savings and Agricultural Credit. *Pak. J. Agri. Sci*, 52(4), 1139-1147.
- Ullah, R., Shivakoti, G. P., Zulfiqar, F., Iqbal, M. N., and Shah, A. A. (2017). Disaster risk management in agriculture: tragedies of the smallholders. *Natural Hazards*, 87(3), 1361-1375.
- United Nations, Economic and Social Council (UNESCO) (2009). Mobile commerce in Africa, an overview with specific reference to South Africa, Kenya and Senegal. In: 1st session of the committee in development information science and technology, executive summary.
- Vaghefi, N., Shamsudin, M. N., Makmom, A., and Bagheri, M. (2011). The economic impacts of climate change on the rice production in Malaysia. *International Journal of Agricultural Research*, 6(1), 67-74.
- Valdivia, C. J., Gilles, J., Espejo, R., and Carrillo, R. (2001). Current Users and Diffusion Nodes of Local Climate Forecasts in the Andes of Bolivia: Lessons on Potential Users, Timing, and Content of Climate Forecast Communications. In IRI Communication of Climate Forecast Information Workshop. Palisades, New York.
- Valdivia, C., Jetté, C., Quiroz, R., Gilles, J. L., and Materer, S. (2002). Peasant households' strategies in the Andes and potential users of climate forecasts: El Niño of 1997–1998. Selected paper for the annual meeting of the American Agricultural Economics Association, July 30-August 2, Tampa, Florida.

- Van den Bergh, J. C. J. M., Ferrer-i-Carbonell, A., and Munda, G. (2000). Alternative models of individual behavior and implications for environmental policy. *Ecological Economics* 32, 43–61.
- Van Audenhove, L. (2003). Towards an integrated information society policy in South Africa: an overview of political rhetoric and policy initiatives 1994-2000: policy. *South African Journal of Communication Theory and Research*, 29(1-2), 129-147.
- Van Winsen, F., Wauters, E., Lauwers, L., de Mey, Y., Van Passel, S., and Vancauteran, M. (2011). Combining risk perception and risk attitude: A comprehensive individual risk behaviour model. Paper presented at EAAE 2011 Congress: Change and Uncertainty, Challenges for Agriculture, Food and Natural Resources. ETH Zurich, Zurich, Switzerland, August 30-September 2.
- Venkatesh, V. (2000). Determinants of perceived ease of use: Integrating control, intrinsic motivation, and emotion into the technology acceptance model. *Information System Research*, 11(4), 342-365.
- Venkatesh, V., and Davis, F. D. (2000). A theoretical extension of the technology acceptance model: four longitudinal field studies. *Management Science*, 46(2), 186-204.
- Venkatesh, V., and Morris, M. G. (2000). Why don't men ever stop to ask for directions? Gender, social influence, and their role in technology acceptance and usage behavior. *MIS quarterly*, 115-139.
- Venkatesh, V., Morris, M. G., Davis, G. B., and Davis, F. D. (2003). User acceptance of information technology: toward a unified View. *MIS Quarterly*, 27(3), 425-478.
- Venkatesh, V., Thong, J. Y., and Xu, X. (2012). Consumer acceptance and use of information technology: extending the unified theory of acceptance and use of technology. *MIS Quarterly*. 36 (1), 157-178.
- Vermeir, I., and Verbeke, W. (2008). Sustainable food consumption among young adults in Belgium: Theory of planned behavior and the role of confidence and values. *Ecological Economics*, 64 (3): 542-553.
- Vogel, C., and O'Brien, K. (2006). Who can eat information? Examining the effectiveness of seasonal climate forecasts and regional climate-risk management strategies. *Climate Research*, 33(1), 111-122.
- Vogel, J., Letson, D., and Herrick, C. (2017). A framework for climate services evaluation and its application to the Caribbean Agrometeorological Initiative. *Climate Services*, 6, 65-76.

- Wachinger, G., Renn, O., Begg, C., and Kuhlicke, C. (2013). The risk perception paradox-implications for governance and communication of natural hazards, *Risk Analysis*, 33, 1049-1065.
- Wagner, K. (2007). Mental models of flash floods and landslides. *Risk Analysis*, 27, 671-682.
- Wang, Y., Lin, H., and Luarn, P. (2006). Predicting consumer intention to use mobile service. *Information Systems Journal*. 16, 157-179.
- Watson, J. T., Gayer, M., and Connolly, M. A. (2007). Epidemics after natural disasters. *Emerging Infectious Diseases*. 13 (1), 1.
- Wauters, E., Bielders, C., Poesen, J., Govers, G., and Mathijs, E. (2010). Adoption of soil conservation practices in Belgium: an examination of the theory of planned behavior in the agri-environmental domain. *Land Use Policy*, 27(1), 86-94.
- Webster, P. (1999). The challenge of sustainability at the farm level: presidential address. *Journal of Agricultural Economics* 50 (3), 371–387.
- Wei, L. H., Osman, M. A., Talib, A. Z., and Lee, W. P. (2012). Enhancing agriculture based livelihoods through technology innovation: Deploying M-community for farmers in Malaysia. *International Journal of Digital Society*.3(3), 681-688.
- Weiss, A., Van Crowder, L., and Bernardi, M. (2000). Communicating agrometeorological information to farming communities. *Agricultural and Forest Meteorology*, 103(1), 185-196.
- Williams, J., and Schroder, W. R. (1999). *Agricultural price risk management: the principles of commodity trading*, Melbourne: Oxford University Press.
- Winkler, J. A., Cinderich, A. B., Ddumba, S. D., Doubler, D., Nikolic, J., Pollyea, A. M., ... and Zavalloni, C. (2013). Understanding the impacts of climate on perennial crops. *Clim. Vulnerability*. <https://doi.org/10.1016/B978-0-12-384703-4.00208-2>
- Wiseman, J., Williamson, L., and Fritze, J. (2010). Community engagement and climate change: Learning from recent Australian experience. *Int. J. Climate Change Strategies Management*, 2 (2), 134-147.
- Wisner, B., and Luce, H. R. (1993). Disaster vulnerability: scale, power and daily life. *Geo Journal*, 30(2), 127-140.
- Woolcock, M., and Narayan, D. (2000). Social capital: Implications for development theory, research, and policy. *The World Bank Research Observer*, 15(2).

- Wossen, T., Abdoulaye, T., Alene, A., Haile, M. G., Feleke, S., Olanrewaju, A., and Manyong, V. (2017). Impacts of extension access and cooperative membership on technology adoption and household welfare. *Journal of Rural Studies*, 54, 223-233.
- Wright, D., Hammond, N., Thomas, G., MacLeod, B., and Abbott, L. K. (2018). The provision of pest and disease information using Information Communication Tools (ICT); an Australian example. *Crop Protection*, 103, 20-29.
- Wyatt, S., and Henwood, F. (2006). 'The best bones in the graveyard' Risky technologies and risks in knowledge. In: Anderson, J., Timmerman, C. (Eds.) *Devises and designs: Medical innovation in historical perspectives*. Palgrave MacMillan, Houndmills, pp. 231-248.
- Xing, H., Jin, J., and Tao, J. (2013). The factors influencing the Hubei farmers' behavior of risk management under agricultural insurance. *Management and Engineering*, (13),105.
- Yakasai, A. B. M., and Jusoh, W. J. W. (2015). Testing the theory of planned behavior in determining intention to use digital coupon among university students. *Procedia Economics and Finance*. 31(1), 186-193.doi: 10.1016/S2212-5671(15)01145-4
- Yamauchi, F., Yohannes, Y., and Quisumbing, A. R. (2009). Natural Disasters, Self-Insurance and Human Capital Investment: Evidence from Bangladesh, Ethiopia and Malawi. World Bank Policy Research Working Paper 4910.
- Yang, D. (2008). Coping with disaster: The impact of hurricanes on international financial flows, 1970-2002. *The B. E. Journal of Economic Analysis and Policy*. 8(1), 1-45.
- Yau, H. K., and Ho, T. C. (2015). The Influence of Subjective Norm on Behavioral Intention In Using E-Learning: An Empirical Study in Hong Kong Higher Education. In *Proceedings of the International MultiConference of Engineers and Computer Scientists*, 2, 2219-485).
- Yoe, C. (2011). *Principles of risk analysis: decision making under uncertainty*. Boca Raton, USA: CRC Press, Taylor and Francis Group.
- Young, D. L. (1979). Risk preferences of agricultural producers: Their use in extension and research. *American Journal of Agricultural Economics*, 61(5).
- Yusop, N. I., Ibrahim, H., Mohd Yusof, S. A., Mat Aji, Z., Md Dahalin, Z., Ghazali, O., ... and Abd Razak, R. (2012). Information needs of rural communities. *The Journal of Community Informatics*, 9(1).

Zahurin, M. A., Huda, H. I., Khairudin, M. K., Nor Iadah, Y., Affendi, M. Y. S., and Zulkhairi, M. D. (2009). Management Practice Sustaining Telecentres. Paper presented at the Seminar Kebangsaan E-Komuniti.

Zakaria, S., and Shaaban, A. J. (2007). Impact of climate change on Malaysia water resources. Paper presented at National Seminar on Socio-Economic Impact of Extreme Weather and Climate Change, organised by the Ministry of Science, Technology and Innovation, Putrajaya, Malaysia. 21-22 June.

Zaremohzzabieh, Z., Samah, B. A., Muhammad, M., Omar, S. Z., Bolong, J., and Shaffril, H. A. M. (2016). An investigation into factors influencing rural youth entrepreneurs' intentions to use ICT: a case of Malaysia. *International Journal of Entrepreneurship and Small Business*, 27(4), 480-504.

Ziervogel, G. (2004). Targeting seasonal climate forecasts for integration into household level decisions: The case of smallholder farmers in Lesotho, *The Geographical Journal*, 170 (1), 6-21.

Zolait, A. H. S. (2014). The nature and components of perceived behavioural control as an element of theory of planned behaviour. *Behaviour and Information Technology*, 33(1), 65-85.

LIST OF PUBLICATIONS

Journal Publication

Ali, M., and Man, N. (2017). Reaching the millions: Accelerating agricultural extension services through information and communication technologies (ICTs). *World Applied Sciences Journal*, 35(3): 352-355. (Published)
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Ali, M., Man, N., Latif, I. A., Muharam, F. M., and Omar, S. Z. (2018). The use of information and communication technologies in agricultural risk management by the agricultural extension services in Malaysia. *Int. J. Agric., Environ. and Food Sci.* 2(1):29-35. (Published)

Conferences

Ali, M., and Man, N. (2017, February 14-16). *Agricultural extension services for agriculture risk management through ICTs in Malaysia*. Paper presented at the International Conference on Agricultural Extension (AGREX'2017), Serdang, Malaysia.

Poster Presentation

Ali, M., and Man, N. (2016, March). *Agriculture risk management through the use of digital technologies in Malaysia*. Poster session presented at the Agri-innovation workshop. Malaysia.

Newspaper Articles

Ali, M., and Man, N. (2016, March 31). Tech help for better farming. *The Star*.

Ali, M., and Man, N. (2016, May 19). Use technology to keep farmers connected. *New Straits Times*.



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