



UNIVERSITI PUTRA MALAYSIA

**APPLICATION OF DATA MINING TECHNIQUES FOR ECONOMIC
EVALUATION OF AIR POLLUTION IMPACT AND CONTROL**

IING LUKMAN

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**APPLICATION OF DATA MINING TECHNIQUES FOR ECONOMIC
EVALUATION OF AIR POLLUTION IMPACT AND CONTROL**



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

August 2007





To all my family,

My teachers, IPB, UPM,

and Tanah Air.....Indonesia

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

**APPLICATION OF DATA MINING TECHNIQUES FOR ECONOMIC
EVALUATION OF AIR POLLUTION IMPACT AND CONTROL**

By

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August 2007

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Faculty : Environmental Studies

In this research we examine aspects of the interdependence between economic development and the use of environmental and natural resources assets from global data published by United Nations. For that purpose, we use data mining techniques.

Data mining techniques applied in this thesis were: 1) Group method of data handling (GMDH), originally from engineering, introducing principles of evolution - inheritance, mutation and selection - for generating a network structure systematically to develop the automatic model, synthesis, and its validation; 2) The weighted least square (WLS) and step wise regression were also applied for some cases; 3) The classification-based association rules were applied.

Data sets for this research consist of two sets integration data of air quality data and macroeconomic data of the cross-country data of World Development Indicator 2003 (WDI 2003), and from www.nationmaster.com. The results from www.nationmaster.com were as follows: the corruption index was strongly related to the urban SO₂ concentration. The corruption index along with NO_x emission has big contribution to the debt. Debt is the debt of the home country to the foreign country or external debt or foreign debt.

The result from WDI 2003 shows that the mortality rate of children under five years old depended on sanitation and water facilities obtained from GMDH results. However, the results from stepwise regression shows that mortality rate was dependent on annual deforestation, particulate matter, nationally protected area, but the big contribution was from annual deforestation.

Based on GMDH, new Gross National Income (GNI) formula was found. Previously GNI was known as Gross National Product (GNP). It was different from the common formula of GNP. The formula or equation model of urban SO₂ concentration was also found through the GMDH algorithms. The results were then compared to WLS and Stepwise regression.

The debt was found by GMDH to be dependent on the corruption index as well as urban SO₂ concentration. Corruption index along with NO_x emission were related to debt.

Results from weighted least square using SAS software showed that the corruption index was significant to the concentration of urban SO₂.

Results from classification rules of the WDI 2003 data showed that the more energy imports net from foreign country was associated with the smaller in adjusted net saving in home country. Energy imports net were calculated as energy use in oil equivalents. This indicated that if the energy imports net was higher, then the adjusted net saving was small, and then CO₂ emissions was small also. Thus, to reduce global warming in home country, a country can import energy from foreign country. According to the result from association rules on nationamaster.com data there were indication that corruption index was related with higher urban SO₂ concentration, and inflation.

Results from association rules of item sets shows that the urban SO₂ always follows the direction of corruption index. In addition, if any country wants to reduce the urban SO₂ concentration, more works can be conducted on controlling corruption index than controlling SO₂ emission per populated area.

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

**APLIKASI TEKNIK PERLOMBONGAN DATA UNTUK PENILAIAN
EKONOMI BAGI IMPAK DAN KAWALAN PENCEMARAN UDARA**

Oleh

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Dalam kajian ini, aspek saling bergantung antara pembangunan ekonomi dengan penggunaan harta alam sekitar dan sumber semulajadi daripada data global yang diterbitkan oleh Bangsa-bangsa Bersatu dikaji. Bagi tujuan itu, kami gunakan kaedah-kaedah perlombongan data.

Kaedah perlombongan data yang digunakan dalam tesis ini adalah: 1) Kaedah kumpulan dalam pengendalian data (GMDH) berasal dari bidang kejuruteraan yang memperkenalkan prinsip evolusi –warisan, mutasi dan pilihan – untuk menjana satu struktur rangkaian yang teratur dalam pembinaan model automatik, sintesis and pengesahannya; 2) Regresi kuasa-dua berpemberat (WLS) dan regresi langkah cerdik juga diaplikasikan untuk sesetengah kes; 3) Peraturan asosiasi berdasarkan klasifikasi digunakan.

Set data untuk kajian ini terdiri daripada dua set integrasi data dari data kualiti udara dan data makroekonomi dari kumpulan data serata dunia dari penunjuk pembinaan dunia 2003 (WDI 2003), dan juga dari www.nationmaster.com. Keputusan dari www.nationmaster.com adalah seperti berikut: indeks rasuah berkait rapat dengan kandungan urban SO₂. Indeks rasuah berserta kepulan NO_x memiliki sumbangan yang besar kepada hutang. Hutang bermakna hutang sesebuah negara sendiri ke negara asing atau hutang ke dunia luar atau hutang ke negara luar.

Keputusan dari WDI 2003 menunjukkan bahawa kadar kematian kanak-kanak dibawah umur lima tahun bergantung kepada kebersihan dan fasiliti air yang diperolehi dari keputusan GMDH. Walau bagaimanapun, keputusan dari regresi langkah cerdik menunjukkan kadar kematian bergantung kepada kepupusan setiap tahun kawasan perhutanan, jirim debu halus, kawasan lindungan negara, tetapi sumbangan besar yalah dari kepupusan setiap tahun kawasan perhutanan.

Berasaskan pada GMDH, kemudiannya formula pendapatan kotor kebangsaan (GNI) yang baru telah ditemui. Dahulunya GNI dikenali sebagai hasil kotor kebangsaan (GNP). Ianya berbeza dengan formula biasa hasil kotor kebangsaan. Formula atau persamaan model kandungan urban SO₂ juga ditemui menggunakan algoritma GMDH. Keputusannya kemudian diperbandingkan dengan keputusan dari WLS dan regresi langkah cerdik.

Hutang ditemui oleh GMDH sebagai bergantung pada indeks rasuah sepermama kandungan urban SO₂. Index rasuah bersama dengan kepulan NO_x berkait kepada hutang. Keputusan dari WLS menggunakan perisian SAS menunjukkan bahawa indeks rasuah penting kepada kandungan urban SO₂.

Keputusan dari peraturan klasifikasi daripada data WDI 2003 menunjukkan bahawa lebih banyaknya impot bersih tenaga dari negara asing berkaitan dengan simpanan bersih terubahsuai yang kecil di negara sendiri. Impot tenaga bersih dicongak sebagai penggunaan tenaga yang disamakan dengan penggunaan minyak. Ini bermakna bahawa jika impot bersih tenaga adalah tinggi, maka simpanan bersih terubahsuai adalah kecil, dan kepulan CO₂ pun kecil. Maka, untuk mengurangkan kepanasan global di negara sendiri, sesebuah negara boleh mengimpot tenaga dari negara asing. Berasaskan pada keputusan dari peraturan asosiasi pada data nationmaster.com ada tanda bahawa indeks rasuah berkait dengan kandungan urban SO₂ dan juga inflasi.

Keputusan dari peraturan asosiasi daripada set-set item menunjukkan bahawa urban SO₂ selalu mengikut hala indeks rasuah. Dengan demikian, jika sesebuah negara ingin mengurangkan kadar kandungan urban SO₂, lebih banyak kerja yg boleh dilaksanakan dengan mengawal indeks rasuah daripada dengan mengawal kepulan SO₂ pada setiap kawasan penduduk.

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I certify that an Examination Committee met on 20 April 2007 to conduct the final examination of Ling Lukman on his Doctor of Philosophy thesis entitled "Data Mining for Economic Evaluation of Air Pollution Impacts and Controls" in accordance with Universiti Pertanian Malaysia (Higher Degree) Act 1980 and Universiti Pertanian Malaysia (Higher Degree) Regulations 1981. The Committee recommends that the candidate be awarded the relevant degree. Members of the Examination Committee are as follows:

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TABLE OF CONTENTS

DEDICATION	ii
ABSTRACT	iii
ABSTRAK	vii
ACKNOWLEDGEMENTS	x
APPROVAL	xiii
DECLARATION	xv
LIST OF TABLES	xviii
LIST OF FIGURES	xxvi
LIST OF ABBREVIATIONS	xix
CHAPTER	
I INTRODUCTION	1
Economic Evaluation of Air Pollution	2
Air Pollution Impacts	2
Data Mining Approach	8
Air Pollution Scenario	19
Problem Statement	22
Scope of the Research	23
Objective of the Research	24
Organisation of the Study	24
II LITERATURE REVIEW	26
Critical Review of Macroeconomic-Environmental Air Pollution	26
Critical Review of Methodology	28
Why Data Mining is Needed	35
Theory-driven Approach	36
Data-driven Approach	37
Data Mining in the Analysis of Air Pollution Data	38
Application of GMDH Algorithms	43
Financial Systems	43
Ecological Process	45
Control Application	46
Other Application	47
III METHODOLOGY	50
General Experimental Methods	50

The Steps of Research Methodology in Data Mining	52
Data Selection	52
Data Cleansing	54
EM Algorithm for Data with Missing Values	55
Hot-deck Imputation	57
Data Enrichment and Coding	59
Data Mining Process	59
Variables for Computation from Nationamaster.com Data	61
Result Interpretation and Validation	66
Incorporation of the Discovered Knowledge	66
Report Writing	66
Group Method of Data Handling (GMDH)	69
The Steps of the GMDH Algorithm	71
Sorting of Models by Groups of Equal Structure	76
External and Internal criteria	76
Physical and Nonphysical Models	77
Deductive and Inductive GMDH Algorithms	78
The problem of Identifying Physical Laws	79
Identify Laws for Noisy Data and Short Samples	81
Basis of the Multilayered Theory of Statistical Decision	83
Normative vector Forecasting for Macroeconomic System	83
Mining Association Rules with Multiple Minimum Supports	94
The Extended Model	98
Mining Large Itemsets with Multiple MISs	100
Downward Closure Property	100
The Algorithm	101
Algorithm MSapriori	103
Candidate Generation	105
Correctness of level2-candidate-gen	105
Subset Function	108
Rule Generation	109
Association Rule Generation Algorithm	109
Problems and Solutions	111
Algorithm New MSapriori	113
Application to Real-Life Data	114
Related Work	114
IV RESULTS AND DISCUSSION	116
Chapter Overview	116
GMD Computation from Nationmaster.com Data	117
GNI Model Development	117
Urban SO ₂ Concentration Model Development	127
Debt of the Countries Model Development	159
The Stepwise Procedure	168
Corruption Index Model Development	179
GMDH Computation from WDI 2003 Data	186

Develop Under 5 Years old Mortality Rate Model Computation	186
The Stepwise Procedure	192
CO ₂ Emission Per Capita Model Development	200
Stepwise Procedure	207
Classification Rules of WDI 2003	215
Results for Single Support	218
Classification Rules from nationmaster.com data set	222
Discussion and Policy	228
Discussion	228
Advantage of Data Mining Techniques	230
Policies	233
V CONCLUSION	239
BIBLIOGRAPHY	246
APPENDICES	257
BIODATA OF THE AUTHOR	323

LIST OF TABLES

Table		Page
1.1	The difference between data mining and typical operational system (Adapted from Berry and Linoff, 2004)	14
3.1	Illustration of Hot Deck Imputation, Data Matrix with Incomplete Data	57
3.2	Illustration of Hot Deck Imputation, Data Matrix with Imputed Data	58
3.3	Data lay-out of Environmental economic data from Nationamaster.com	64
3.4	Data lay-out of World Development Indicator 2003	65
4.1	Results of Process finding the model layer by layer, where GNI is the goal function	118
4.2	Polynomial coefficients, where GNI is the goal function	122
4.3	MSE, MAPE, r , and R^2 for polynomial in Table 4.2	123
4.4	Model values calculated on validation sub-sample	125
4.5	Results of Process finding the model layer by layer, where Urban SO ₂ is the Goal function	128
4.6	The Polynomial Coefficients, where Urban SO ₂ is the goal function	131
4.7	MSE, MAPE, r , and R^2 for polynomial in Table 4.6	132
4.8	Model values calculated on validation sub-sample	132
4.9	The Reg Procedure of model 1, where UrbSO ₂ is dependent variable	137
4.10	Parameter Estimates of the WLS procedures of Table 4.9	138
4.11	The Reg procedure model 2, where dependent variable is UrbSO ₂	139

4.12	Parameter Estimates of the WLS procedures of Table 4.11	139
4.13	The Reg procedure model 3, where dependent variable is: UrbSO ₂	140
4.14	Parameter Estimates of the WLS procedure of Table 4.13	139
4.15	The Regression procedure model 4, where dependent variable is UrbSO ₂	141
4.16	Parameter Estimates of the WLS procedure of Table 4.15	140
4.17	Stepwise Procedure of Maximum R-Square Improvement: Step 1	144
4.18	Parameter Estimates of Table 4.16, where Urban SO ₂ concentration is the dependent variable	145
4.19	Stepwise Procedure of Maximum R-Square Improvement: Step 2	145
4.20	Parameter Estimates of Table 4.19, where Urban SO ₂ concentration is the dependent variable	146
4.21	Stepwise Procedure of Maximum R-Square Improvement: Step 3	145
4.22	Parameter Estimates of Table 4.21, where Urban SO ₂ concentration is the dependent variable	147
4.23	Stepwise Procedure of Maximum R-Square Improvement: Step 4	146
4.24	Parameter Estimates of Table 4.23, where Urban SO ₂ concentration is the dependent variable	148
4.25	Stepwise Procedure of Maximum R-Square Improvement: Step 5	148
4.26	Parameter Estimates of Table 4.25, where Urban SO ₂ concentration is the dependent variable	149
4.27	Stepwise Procedure of Maximum R-Square Improvement: Step 6	150
4.28	Parameter Estimates of Table 4.27, where Urban SO ₂ concentration is the dependent variable	151

4.29	Stepwise Procedure of Maximum R-Square Improvement: Step 7	151
4.30	Parameter Estimates of Table 4.29, where Urban SO ₂ concentration is the dependent variable	152
4.31	Stepwise Procedure of Maximum R-Square Improvement: Step 8	152
4.32	Parameter Estimates of Table 4.31, where Urban SO ₂ concentration is the dependent variable	152
4.33	Stepwise Procedure of Maximum R-Square Improvement: Step 9	154
4.34	Parameter Estimates of Table 4.33, where Urban SO ₂ concentration is the dependent variable	155
4.35	Stepwise Procedure of Maximum R-Square Improvement: Step 10	155
4.36	Parameter Estimates of Table 4.35, where Urban SO ₂ concentration is the dependent variable	156
4.37	Stepwise Procedure of Maximum R-Square Improvement: Step 11	156
4.38	Parameter Estimates of Table 4.37, where Urban SO ₂ concentration is the dependent variable	157
4.39	Stepwise Procedure of Maximum R-Square Improvement: Step 30	158
4.40	Parameter Estimates of Table 4.39, where Urban SO ₂ concentration is the dependent variable	159
4.41	Results of Process finding the model layer by layer, where Debt of the countries is the Goal function	160
4.42	The Polynomial Coefficients, where debt is the goal function	164
4.43	MSE, MAPE, <i>r</i> , and <i>R</i> ² for polynomial in Table 4.42	166
4.44	Model values calculated on validation subsample	167

4.45	Stepwise Procedure of Maximum R-Square Improvement: Step 3	169
4.46	Parameter Estimates of Table 4.45, where Debt is the dependent variable	170
4.47	Stepwise Procedure of Maximum R-Square Improvement: Step 4	170
4.48	Parameter Estimates of Table 4.47, where Debt is the dependent variable	171
4.49	Stepwise Procedure of Maximum R-Square Improvement: Step 5	171
4.50	Parameter Estimates of Table 4.49, where Debt is the dependent variable	172
4.51	Stepwise Procedure of Maximum R-Square Improvement: Step 6	172
4.52	Parameter Estimates of Table 4.51, where Debt is the dependent variable	173
4.53	Stepwise Procedure of Maximum R-Square Improvement: Step 7	174
4.54	Parameter Estimates of Table 4.53, where Debt is the dependent variable	175
4.55	Stepwise Procedure of Maximum R-Square Improvement: Step 8	175
4.56	Parameter Estimates of Table 4.55, where Debt is the dependent variable	176
4.57	Stepwise Procedure of Maximum R-Square Improvement: Step 9	176
4.58	Parameter Estimates of Table 4.57, where Debt is the dependent variable	177
4.59	Stepwise Procedure of Maximum R-Square Improvement: Step 10	178

4.60	Parameter Estimates of Table 4.59, where Debt is the dependent variable	179
4.61	Results of Process finding the model layer by layer: Corruption Index of the countries as the Goal function	180
4.62	Polynomial coefficients of Table 4.61	183
4.63	MSE, MAPE, r , and R^2 for polynomial in Table 4.62	184
4.64	Model values calculated on validation subsample	185
4.65	Results of Process finding the model layer by layer: Children under five years old mortality rate of the countries as the Goal function	187
4.66	Polynomial coefficients of Table 4.65	189
4.67	MSE, MAPE, r , and R^2 for polynomial in Table 4.66	189
4.68	Model values calculated on validation subsample	191
4.69	Stepwise Procedure of Maximum R-Square Improvement: Step 5	193
4.70	Parameter Estimates of Table 4.69, where Under-five years old mortality rate is the dependent variable	194
4.71	Stepwise Procedure of Maximum R-Square Improvement: Step 6	194
4.72	Parameter Estimates of Table 4.71, where Under-five years old mortality rate is the dependent variable	195
4.73	Stepwise Procedure of Maximum R-Square Improvement: Step 7	195
4.74	Parameter Estimates of Table 4.73, where Under-five years old mortality rate is the dependent variable	196
4.75	Stepwise Procedure of Maximum R-Square Improvement: Step 14	197
4.76	Parameter Estimates of Table 4.75, where Under-five years old mortality rate is the dependent variable	198

4.77	Stepwise Procedure of Maximum R-Square Improvement: Step 31	198
4.78	Parameter Estimates of Table 4.77, where Under-five years old mortality rate is the dependent variable	200
4.79	Results of Process finding the model layer by layer: CO ₂ emission Per capita as Goal function	201
4.80	Polynomial coefficients of Table 4.79	204
4.81	MSE, MAPE, <i>r</i> , and <i>R</i> ² for polynomial in Table 4.80	205
4.82	Stepwise Procedure of Maximum R-Square Improvement: Step 3	207
4.83	Parameter Estimates of Table 4.82, where CO ₂ emission per capita is the dependent variable	208
4.84	Stepwise Procedure of Maximum R-Square Improvement: Step 9	208
4.85	Parameter Estimates of Table 4.84, where CO ₂ emission per capita is the dependent variable	210
4.86	Stepwise Procedure of Maximum R-Square Improvement: Step 16	210
4.87	Parameter Estimates of Table 4.86, where CO ₂ emission per capita is the dependent variable	211
4.88	Stepwise Procedure of Maximum R-Square Improvement: Step 56	212
4.89	Parameter Estimates of Table 4.88, where CO ₂ emission per capita is the dependent variable	213
4.90	Mining Classification Rules from WDI 2003 Data set with number of training case is 205 with multiple supports.	216
4.91	Mining Classification Rules from WDI 2003 Data set with number of training case is 205 with single support.	219
4.92	Interesting itemset rules generated from mining association rules WDI 2003 data set out of 1865 itemset rules : MinSup:10.000%, MinConf:50.000% RuleLimit : 80000	221

- LevelLimit : 4. NumTrainingCase= 205
- 4.93 Important Classification Rule mined from nationamaster data set, the Rules are generated at : MinSup:10.000%, MinConf:50.000% RuleLimit : 80000 LevelLimit : 6 222
- 4.94 Interesting itemsets rules generated from association rule mining for nationmaster data set from 929 rules generated. The Rules are generated at : MinSup:10.000%, MinConf:50.000% RuleLimit : 80000 LevelLimit : 4. NumTrainingCase== 95 223

