

**WG3 Demand Forecast
Material 3**

Simple-E Installation and Operation

20~24 December 2021
Asiam Research Institute, Inc.
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*Section 1
Installation of the Software*

Preparations

What we need ?

Documents we have send to you.

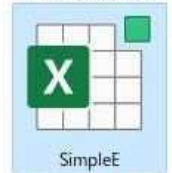
(1) Software: "SimpleE.xlam"

(2) A excel file: "data 1_cambodia.xlsx"

(3) A PDF file: "material_3_simpleE installation and operation.pdf"



data 1_cambodia



SimpleE



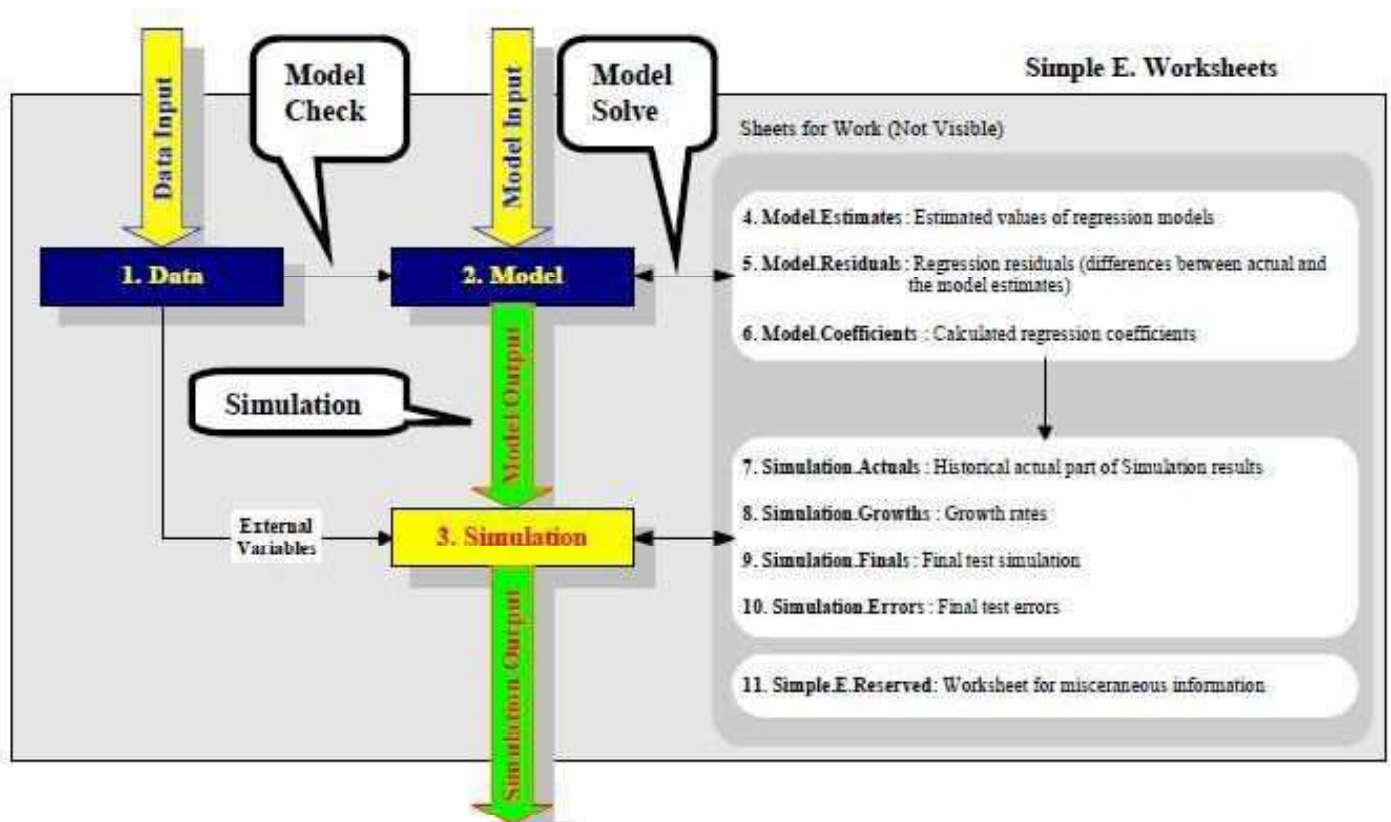
material_3_simple
E installation and
operation

Prepare by yourself

(4) A computer with Microsoft Office "Excel".

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Conceptual Diagram of SEE

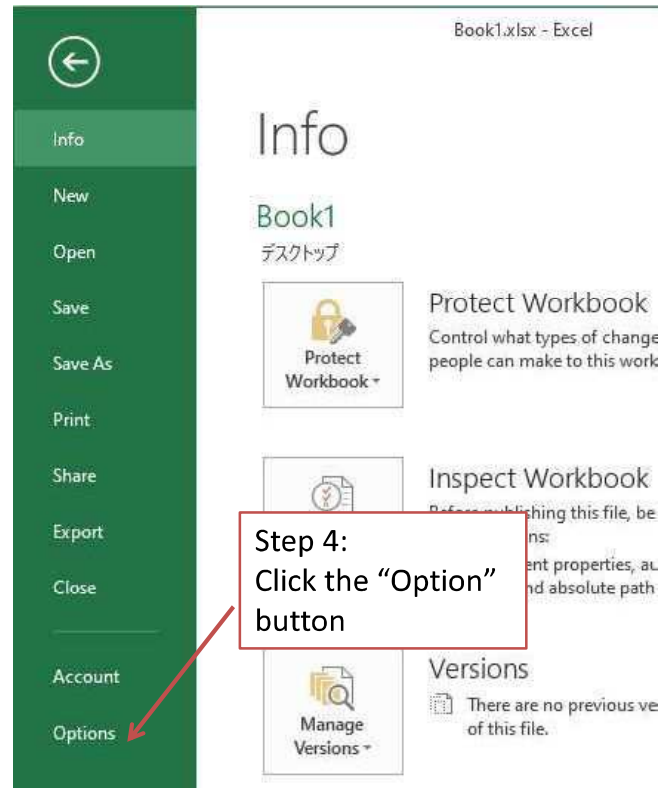
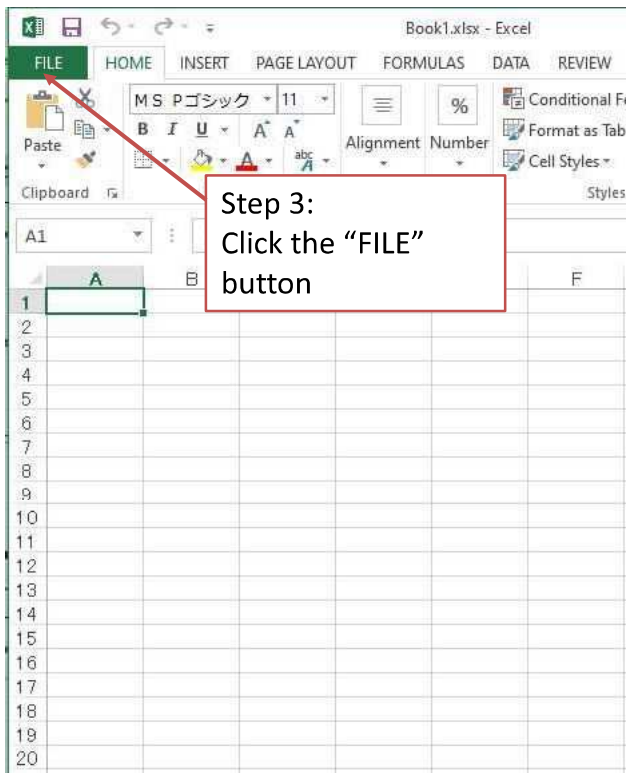


4

Install the SEE to your Excel File

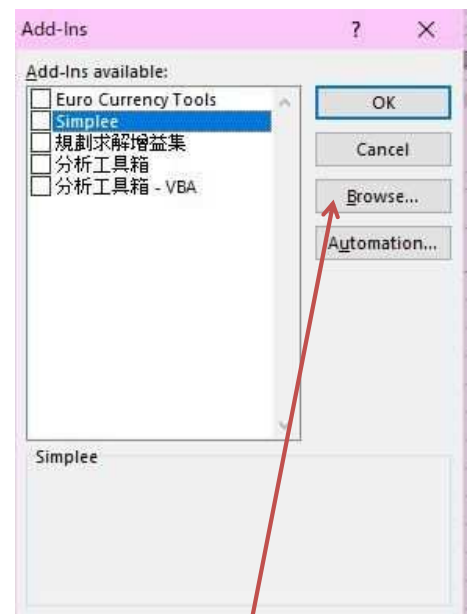
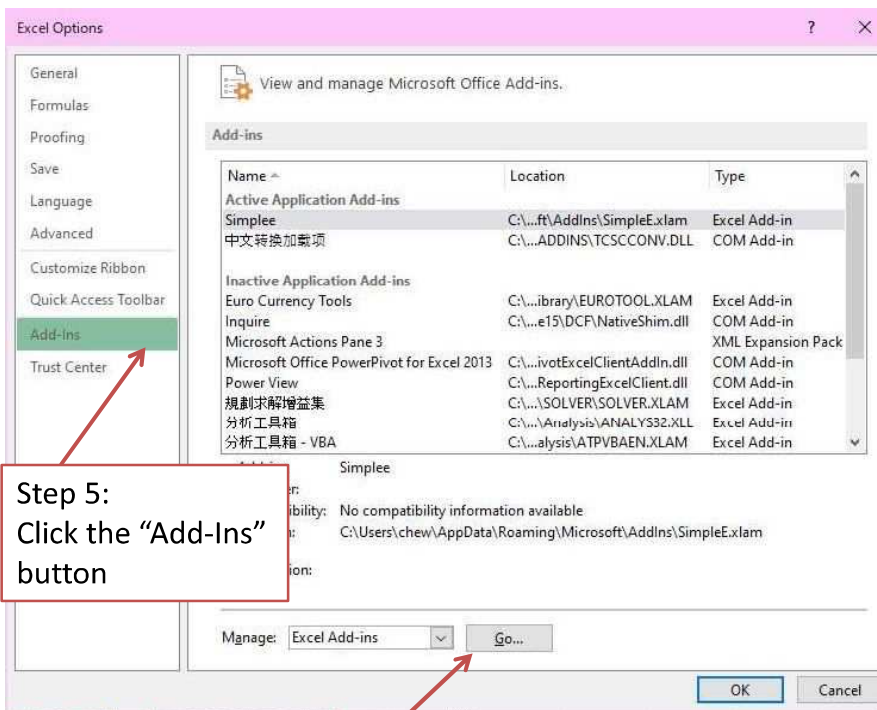
Step1: Copy the "SimpleE.xlam" file to your computer (you can put it on your desktop).

Step2: Open a new "excel" file.



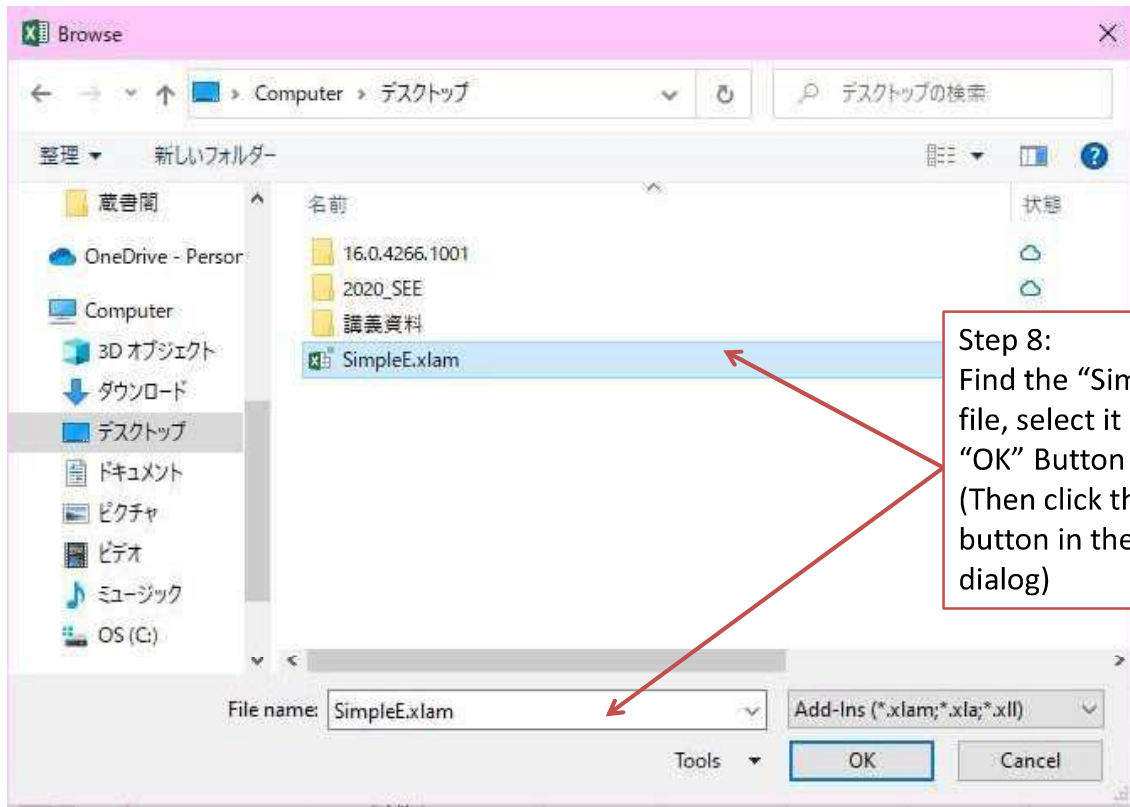
5

Install the SEE to your Excel File ~...continued



6

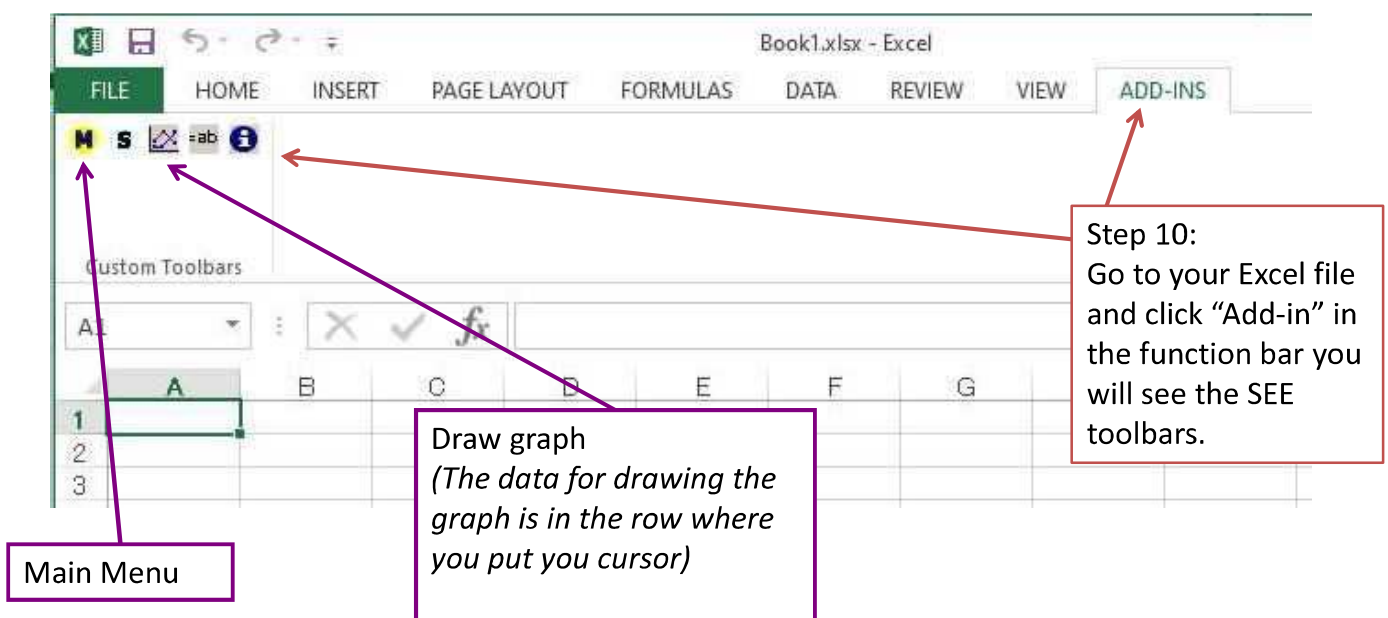
Install the SEE to your Excel File ~...continued



7

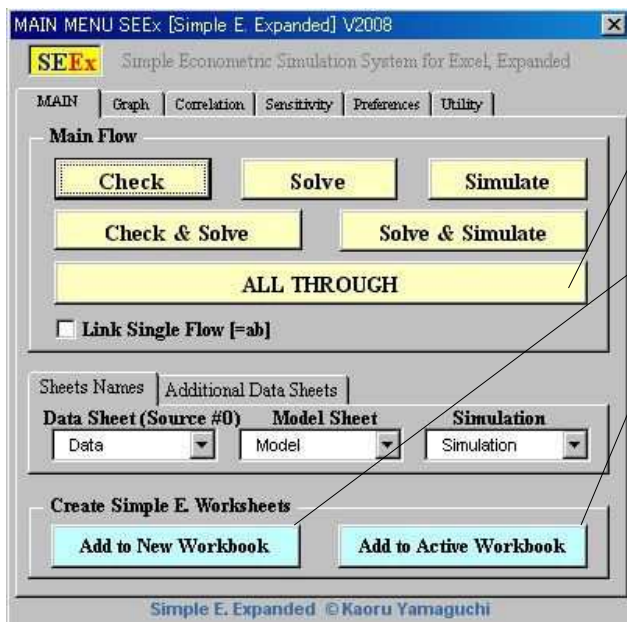
Install the SEE to your Excel File ~...continued

Step9: Close the Excel file and re-open a new Excel file.



8

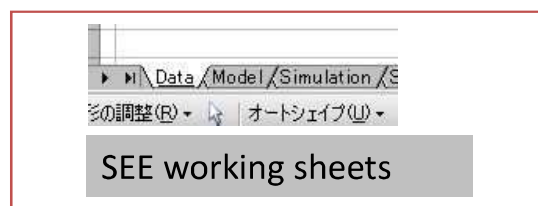
Main Menu of the SEE



Button to start the simulation of the whole model.

Button to create SEE working sheets in a new file .

Button to create SEE working sheets in the current file .



Section 2 How to Start Model Building With SEE

Before start SEE, you need to....

(1) Formulation the question of interest

Example: Total Primary Energy Supply (TPES) analysis

(2) Specify variables

TPES is a function of GDP (Real GDP)

$$TPES = f(GDP)$$

$$\text{or } TPES = a + b \times GDP + u$$

- **Result** TPES: Dependent variable
- **Cause** GDP: Independent variable

(3) Collect Data

Source, Period of time, Unit etc.

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How to start model building with SEE

□ Then with SEE

- Input the data in the “**data sheet**”
- Build your model in the “**model sheet**”
- Test the fitness of your estimation by checking the parameters in the “**model sheet**”
- The prediction results are given in the “**simulation sheet**”

□ After...

- You can do any analysis you like with the output data

Practice (file: data_1_Cambodia)

(1) Formulation the question of interest

Total Primary Energy Supply (TPES) analysis of Cambodia

(2) Specify variables

TPES is a function of GDP (Real GDP of Cambodia)

$$\text{Cambodia TPES} = f(\text{Cambodia GDP})$$

$$\text{or TPES} = a + b * \text{GDP} + u$$

- **Result** TPES: Dependent variable
- **Cause** GDP: Independent variable

(3) Collect Data

Source, Period of time, Unit etc.

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Input data

	Coal	Natural Gas	Crude Oil	LPG	Gasoline	Jet Fuel	Kerosene	Diesel Oil	Fuel Oil	Naphtha
Production	882	274	20	0	0	0	0	0	0	0
Imports	3853	0	12738	633	1043	215	36	2330	387	20
Exports	0	0	0	0	0	0	0	-136	-716	-533
International Marine Bunkers	0	0	0	0	0	0	0	-81	-103	0
Stock Changes	0	0	-116	-5	-2	-1	-4	-43	51	-31
Total Primary Energy Supply	4735	2174								
Statistical Differences	200	0	0	0	0	0	0	0	0	0
Total Transformation Sector	-3864	-2174								
Main Activity Producers Electricity Plant	-3630	-2174								
Autoproducer Electricity Plant	0	0								
Petroleum Refineries	0	0								
Coal Mines	-234	0								
Oil and Gas Extraction	0	0								
Petroleum Refineries	0	0								
Own Use in Electricity, GHP and Heat Plant	0	0								
Distribution Losses	0	0								
Total Final Consumption	1071									
Total Industry Sector	932									
Iron and Steel	9									
Chemical and Petrochemical	18									
Non-Metallic Minerals	905									
Machinery	0									
Mining and Quarrying	0									
Food and Tobacco	0									
Paper, Pulp and Printing	0									
Wood and Wood Products	0									
Construction	0									
Textile and Leather	0									
Non-specified Industry	0									
Total Transport Sector	0									
International Aviation	0									
Domestic Aviation	0									
Road	0									
Rail	0									
Domestic Navigation	0									
Total Other Sectors	0									
Agriculture	0									
Commercial and Public Services	0									
Residential	0									
Non-specified Other	0									
Non-Energy Use	139									
Electricity Output in GWh	14517	1314								

C47		%										
A	B	C	K	L	M	N	O	P	Q	R	S	T
1	Title and Comments	C	TREND	1	2	3	4	5	6	7	8	9
2	A	B	TIME	1990	1991	1992	1993	1994	1995	1996	1997	1998
3	METI GDP (Constant 2000 Price)	Billion \$	GDP	3,206	3,482	3,749	4,316	4,751	5,005	4,413	4,049	3,824
4	ARI Annual Groth Rate of GDP	%	GDPR	6	2.3	0.7	-0.5	1.5	1.9	2.6	1.6	-2.0
5	EDMC Population	Million	POP	124	124.1	124.6	124.9	125.3	125.6	125.9	126.2	126.5
6	Production index(2005=100)											
7	EDMC Industry		IPID	100	99.7	93.8	90.4	93.2	95.2	98.4	99.5	92.7
8	EDMC Commercial		IPCM	84	86.6	86.1	87.0	88.6	90.7	93.0	92.6	92.7
9	Electricity Consumption											
10	IEA Total final consumption	TWh	ELTL	769	795	800	810	862	885	906	928	932
11	IEA Industry	TWh	ELID	337	342	335	330	345	351	359	364	350
12	IEA Transport	TWh	ELTR	17	18	18	18	18	19	19	19	19
13	IEA Residential	TWh	ELRS	184	192	198	204	221	230	233	236	245
14	IEA Commercial	TWh	ELCM	210	220	226	231	251	257	266	277	289
15	IEA Agriculture	TWh	ELAG	2	1	2	1	2	2	2	2	2
16	IEA Others	TWh	ELOT	19	22	21	26	25	26	27	30	29
17	Structure of consumption			100	100	100	100	100	100	100	100	100
18	ARI Industry	%	STID	43.9	43.0	41.9	40.8	40.0	39.7	39.6	39.3	37.5
19	ARI Transport	%	STTR	2.2	2.2	2.2	2.2	2.1	2.1	2.1	2.0	2.0
20	ARI Residential	%	STRS	24.0	24.1	24.8	25.2	25.6	26.0	25.7	25.5	26.2
21	ARI Commercial	%	STCM	27.3	27.7	28.2	28.5	29.1	29.1	29.4	29.8	31.0
22	ARI Agriculture	%	STAG	0.2	0.2	0.2	0.2	0.2	0.2	0.2	0.2	0.2
23	ARI Others	%	STOT	2.5	2.8	2.6	3.2	2.9	3.0	3.0	3.2	3.1
25	METI Electricity Demand	TWh	ELEC	834.6	862.7	869.2	877.2	935.0	958.9	979.6	1,002.4	1,007.9
26	METI Nuclear	TWh	NUCL	202.3	213.5	223.3	249.3	269.1	291.3	302.2	319.2	332.3
27	METI Natural Gas	TWh	NAGS	167.1	179.5	178.5	178.0	191.7	195.6	207.6	217.1	225.0
28	METI Coal and Coal products	TWh	COAL	116.7	124.6	131.7	141.3	155.5	168.7	178.1	191.2	192.0
29	METI Oil and oil products	TWh	DISL	247.9	236.0	241.3	201.4	238.9	206.8	195.8	168.6	149.8

“Data” Sheet of SEE

Define the Code Name for all the variables and input data.

Free area

Input the data for the variables here.

Usually we put the comments of the Code Name here. For example, their **meanings, units, and the sources** where you get the data, etc...

Input time series here. It ends with the year (or month, day, etc...) till which you want to forecast.

Put the **Code Name of the dependent variable** here. Pay attention to that the code name should be exactly the same as what you have input in the “data” sheet

Title and Comments				TREND	1	2	3	4	5	6	7	8
A	B	C	K	TIME	1971	1972	1973	1974	1975	1976	1977	1978
Sources				Gross Domestic Product (GDP), constant (2005) prices - US dollars								
UN Database	Brunei	Million USD	GDP.BR		4,145	4,568	5,003	5,580				
UN Database	China	Million USD	GDP.CH		128,107	132,975	143,480					
UN Database	Indonesia	Million USD	GDP.IN		40,534	44,349	49,300					
UN Database	Malaysia	Million USD	GDP.MA		16,481	16,934	18,400					
UN Database	Peru	Million USD	GDP.PE		35,208	36,219	38,160					
UN Database	Philippines	Million USD	GDP.PH		31,176	32,874	35,806					
UN Database	Thailand	Million USD	GDP.TH		22,792	23,720	26,059	27,184	28,320	30,480	32,760	37,848
UN Database	Vietnam	Million USD	GDP.VI		7,366	7,511	7,404	7,588	7,814	8,874	9,850	10,024
Total Primary Energy Supply												
OECD/IEA	Brunei	ktoe	TPES.BR		177	178	344	594	740	978	1,055	988
OECD/IEA	China	ktoe	TPES.CH		381,708	411,998	427,960					
OECD/IEA	Indonesia	ktoe	TPES.IN		35,058	36,493	38,163					
OECD/IEA	Malaysia	ktoe	TPES.MA		5,888	5,978	5,945					
OECD/IEA	Peru	ktoe	TPES.PE		9,128	9,130	9,511					
OECD/IEA	Philippines	ktoe	TPES.PH		15,578	15,649	17,403					
OECD/IEA	Thailand	ktoe	TPES.TH		13,690	14,370	15,607					
OECD/IEA	Vietnam	ktoe	TPES.VI		17,441	17,664	18,378					

Set Up Code Name

Title and Comments				TREND	1	2	3	4	5	6	7	8	9
A	B	C	K	TIME	1990	1991	1992	1993	1994	1995	1996	1997	1998
METI	GDP (Constant 2000 Price)	Billion \$	GDP		3,206	3,482	3,749	4,316	4,751	5,005	4,413	4,049	3,824
ARI	Annual Groth Rate of GDP	%	G DPR		6	2.3	0.7	-0.5	1.5	1.9	2.6	1.6	-2.0
EDMC	Population	Million	POPU		124	124.1	124.6	124.9	125.3	125.6	125.9	126.2	126.5
Production index(2005=100)													
EDMC	Industry		IPID		100	99.7	93.8	90.4	93.2	95.2	98.4	99.5	92.7
EDMC	Commercial		IPCM		84	86.6	86.1	87.0	88.6	90.7	93.0	92.6	92.7
Electricity Consumption													
IEA	Total final consumption	TWh	ELTL		769	795	800	810	862	885	906	928	932
IEA	Industry	TWh	ELID		337	342	335	330	345	351	359	364	350
IEA	Transport	TWh	ELTR		17	18	18	18	18	19	19	19	19
IEA	Residential	TWh	ELRS		184	192	198	204	221	230	233	236	245
IEA	Commercial	TWh	ELCM		210	220	226	231	251	257	266	277	289
IEA	Agriculture	TWh	ELAG		2	1	2	1	2	2	2	2	2
IEA	Others	TWh	ELOT		19	22	21	26	25	26	27	30	29
Structure of consumption					100	100	100	100	100	100	100	100	100
ARI	Industry	%	STID		43.9	43.0	41.9	40.8	40.0	39.7	39.6	39.3	37.5
ARI	Transport	%	STTR		2.2	2.2	2.2	2.2	2.1	2.1	2.1	2.0	2.0
ARI	Residential	%	STRS		24.0	24.1	24.8	25.2	25.6	26.0	25.7	25.5	26.2
ARI	Commercial	%	STCM		27.3	27.7	28.2	28.5	29.1	29.1	29.4	29.8	31.0
ARI	Agriculture	%	STAG		0.2	0.2	0.2	0.2	0.2	0.2	0.2	0.2	0.2
ARI	Others	%	STOT		2.5	2.8	2.6	3.2	2.9	3.0	3.0	3.2	3.1
Electricity Demand													
METI	Electricity Demand	TWh	ELEC		834.6	862.7	869.2	877.2	935.0	958.9	979.6	1,002.4	1,007.9
METI	Nuclear	TWh	NUCL		202.3	213.5	223.3	249.3	269.1	291.3	302.2	319.2	332.3
METI	Natural Gas	TWh	NAGS		167.1	179.5	178.5	178.0	191.7	195.6	207.6	217.1	225.0
METI	Coal and Coal products	TWh	COAL		116.7	124.6	131.7	141.3	155.5	168.7	178.1	191.2	192.0
METI	Oil and oil products	TWh	DISL		247.9	236.0	241.3	201.4	238.9	206.8	195.8	168.6	149.8

"Code Name"

Code Name	Code	Coal + Coal products	Bituminous	Lignite	Coke	Coke Oven Gas	Blast Furnace Gas	Crude Oil + Petroleum Products Total	Crude Oil	Petroleum Products Total	Gasoline	Diesel	Fuel Oil	LPG	Kerosene	Jet	Non Energy	Refinery Gas	Natural Gas + LNG	Natural Gas	LNG	
3rd Step PRIMARY ENERGY SUPPLY		CL	BI	LI	CO	CG	BG	OIL	CR	PT	GS	DO	DO	LPG	KRO	JT	NE	RG	TNG	NG	LNG	
Indigenous Production	IP																					
Imports	IM																					
Exports	EX																					
International Marine Bunkers	MB																					
International Civil Aviation	CA																					
Stockpile Change	ST																					
Total Primary Energy Supply	PR																					
2nd Step ENERGY CONVERSION & OWN USE																						
Power Generation	EL																					
Auto Power Generation	IPP																					
Industrial Steam Generation	IS																					
District Heat Supply	HS																					
Town Gas Production	TG																					
Coal Products	CP																					
Oil Products	OP																					
Total Conversion	TC																					
Own Use & Loss	LS																					
Statistical Discrepancy	DC																					
1st Step FINAL USE																						
Industrial	IN																					
Transport	TR																					
Agriculture	AG																					
Commercial	CM																					
Residential	RE																					
Non-Energy Use	NE																					

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"Model" Sheet of SEE (left half)

Build your model on the left half of the "model" sheet.

Internal Y	Option Type	X1	X2	X3	X4	X5

Type Options
 Blank or \$LS or \$OLS: Least Square
 \$EQ or "=": Equal
 \$DL: Double-Log
 \$SL: Semi-Log
 \$NC: No-constant
 \$CA: Constant Adj.
 \$TL: Linear Trend
 \$TG: Growth Trend
 ...And More

Usually we put the comments of the Code Name here. For example, their *meanings*, *units*, and the *sources* where you get the data, etc...

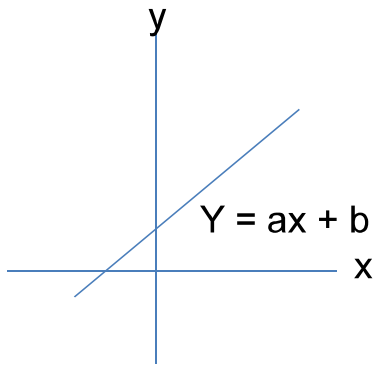
Put the *Code Name* of the dependent variable *y* here. Pay attention to that the code name should be exactly the same as what you have input in the "data" sheet

Input the *Code Names* of the independent variables here. Pay attention to that the code name should be exactly the same as what you have input in the "data" sheet.

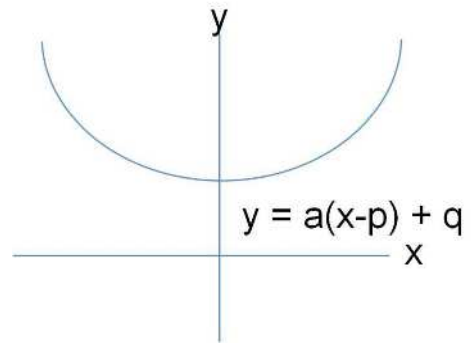
"Option Type" includes ① the form of relationship between *Y* and *X1, X2, ...* (equal, linear (OLS), Double-log, Semi-log, etc...), and ② how you want *Y* to change with time (Linear trend, Growth trend, etc...)

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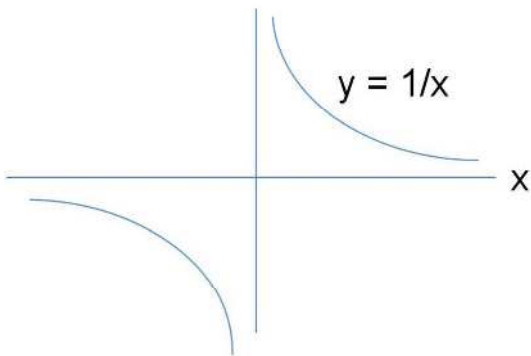
Typical Function Forms



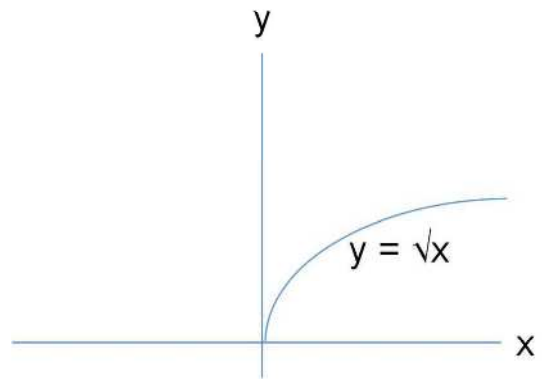
Linear Function



Quadratic Function

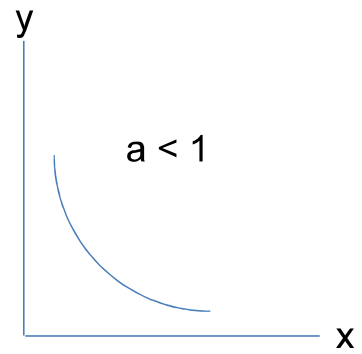
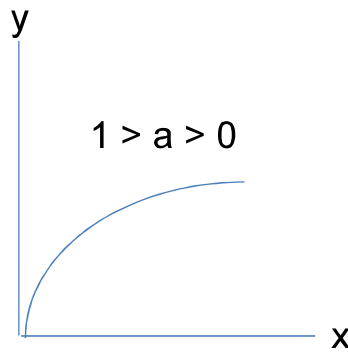
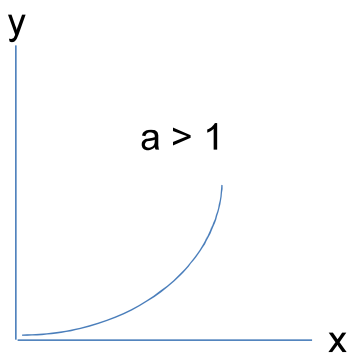


Fractional Function

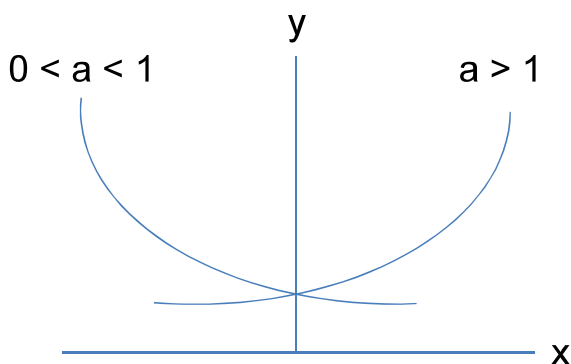


Irrational Function

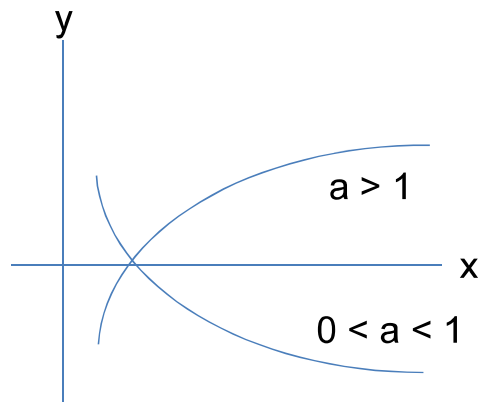
19



Power Function ($y = x^a$)



Exponential Function ($y = a^x$) ($a > 0$)

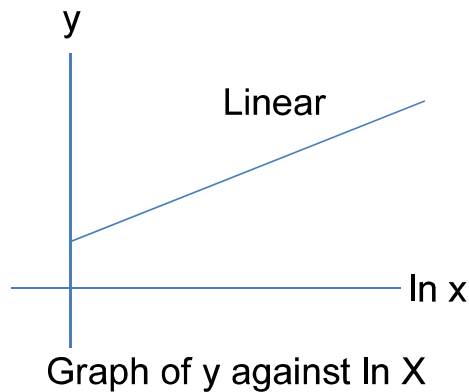
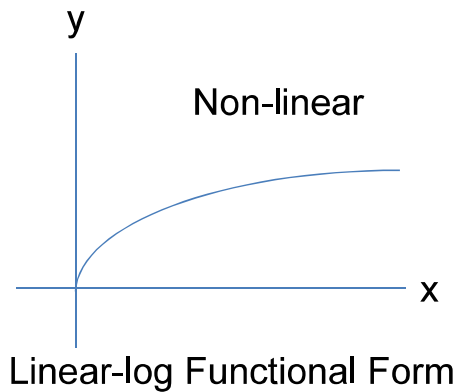


Logarithmic Function ($y = \log_a x$)

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Linearization Forms

Non-linear	Transformation	Linear	Constraints
1) $y = ax^b$	$Y = \log y, X = \log x$	$Y = a' + bX$	$x > 0, y > 0, a > 0$
2) $y = e^{a+bx}$	$Y = \log y$	$Y = a + bx$	$y > 0$
3) $y = e^{a+bx} / (1 + e^{a+bx})$	$Y = \log (y / (1 - y))$	$Y = a + bx$	$0 < y < 1$



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Typical Function Forms in Simple-e

	Internal Y	Option Type	X1	X2	X3	X4
Typical Functional Form						
$Y = a + b*X$	DEMAND		GNP.R			
$Y = a + b*X + c*Y(-1)$	DEMAND		GNP.R	lag1.DEMAND		
$LN(Y) = a + b*LN(X)$	DEMAND	\$DL	GNP.R			
$LN(Y) = a + b*X$	DEMAND	\$SL	GNP.R			
$Y = a + b*LN(X)$	DEMAND		LN(GNP.R)			
$LN(Y) = a + b*LN(X) + c*LN(Y(-1))$	DEMAND	\$DL	GNP.R	lag1.DEMAND		
$LN(Y) = a + b*LN(X1) + c*LN(Y(-1)) + d*X2$	DEMAND	\$DL	GNP.R	lag1.DEMAND	exp(TREND)	
$Y = a + b*X1 + c*X2$	DEMAND		GNP.R	PRICE		
$Y = a + b*X1 + c*X2 + d*Y(-1)$	DEMAND		GNP.R	PRICE	lag1.DEMAND	
$LN(Y) = a + b*LN(X1) + c*LN(X2)$	DEMAND	\$DL	GNP.R	PRICE		
$LN(Y) = a + b*X1 + c*X2$	DEMAND	\$SL	GNP.R	PRICE		
$Y = a + b*LN(X1) + c*LN(X2)$	DEMAND		LN(GNP.R)	LN(PRICE)		
$Y = a + b*LN(X1) + c*X2$	DEMAND		LN(GNP.R)	PRICE		
$LN(Y) = a + b*LN(X1) + c*LN(X2) + d*LN(Y(-1))$	DEMAND	\$DL	GNP.R	PRICE	lag1.DEMAND	
$LN(Y) = a + b*LN(X1) + c*LN(X2) + d*LN(Y(-1)) + e*X3$	DEMAND	\$DL	GNP.R	PRICE	lag1.DEMAND	exp(TREND)

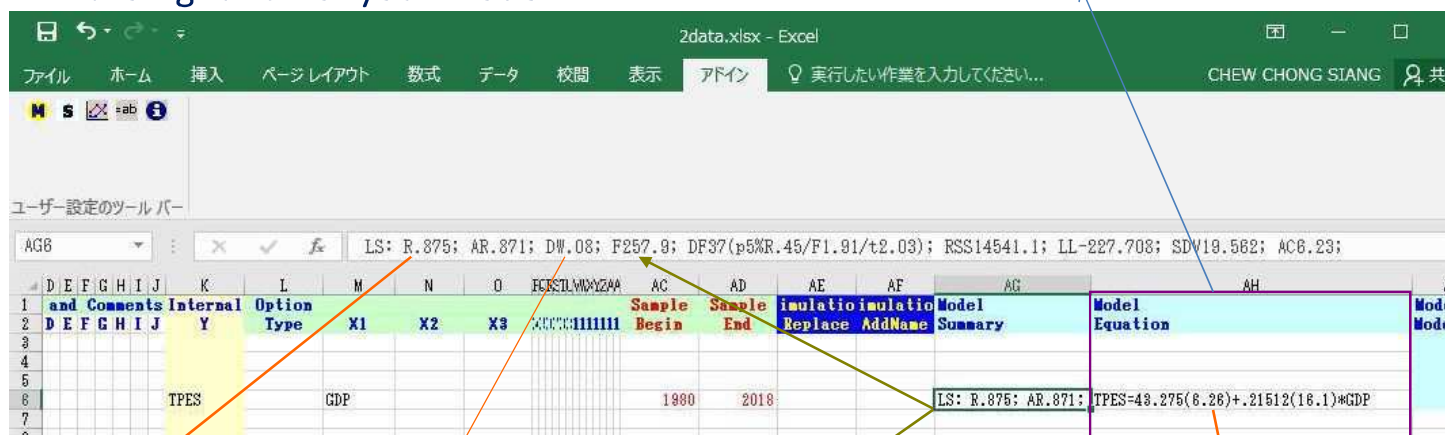
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Inspection the model

Model equation

Check the fitness of your model on the right half of your model.

$$TPES = 43.275(6.26) + 0.21512(16.1) * GDP$$



① R-squared = 0.875

Parameters for testing the fitness of the model

② T-value = (6.26)

③ Durbin-Watson testing value = 0.08

Notice: After building the model, go to the "main menu" and click the "All through" button. The equation of the model and the parameters for testing the fitness of the model will be displayed on the right half of the "model".

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Parameters for testing the fitness of your model (estimation)

(1) R	R-Square, $0 \leq \text{Explained variance} / \text{Total variance} \leq 1$, (The larger the better)
(2) AR	Adjusted R-Square, $AR \leq 1$, (The larger the better)
(3) SD	$SD = (\sum e^2 / (n-k))^{1/2}$, e = Residual, n = Sample size, k = No. of independent variables
(4) t-value	$ t \geq 2$: Significant $2 > t \geq 1$: Admissible to use $ t < 1$: Insignificant
(5) DW	Durbin Watson Statistics, $1 < DW < 3$ DW = 2 : No serial correlation DW \rightarrow 0 : Positive correlation DW \rightarrow 4 : Negative correlation
(6) Dh	Duebinh Statistics with lag, $ Dh < 2$
(7) Rho	Coefficient of serial correlation, $ Rho < 1$
(8) DF	Degree of Freedom, $DF > 1$ (The lager the better)
(9) F	F-Statistics, $F > 0$ (The larger the better)
(10) RSS	Residual Sum of Square, $RSS > 0$ (The smaller the better)
(11) YX	Correlation Coefficient between Y and X's, $ YX < 1$
(12) XX	Correlation Coefficient between X's, $ XX < 0.95$

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“Simulation” Sheet of SEE

In “Data” sheet, Input the target year for simulation

	AU	AV	AW	AX	AY	AZ	BA	BB	BC	BD	BE	BF
1	36	37	38	39	40	41	42	43	44	45	46	47
2	2015	2016	2017	2018	2019	2020	2021	2022	2023	2024	2025	
3												
4												
5												
6	432.44	427.2	431.88	428	419.08							
7	4389.48	4412.39	4508.06	4522.63	4552.22							
8												
9												

Once click the “All through” button in the Main Menu and if there are no bugs in your model, the simulation results (the model outputs) will be displayed in the “simulation” sheet automatically.

	A#	AX	AY	AZ	BA	BB	BC	BD	BE	BF	BG	BH	BI	BJ
1	38	39	40	41	42	43	44	45	46	47	48	49	50	51
2	2017	2018	2019	2020	2021	2022	2023	2024	2025	<Sparkli	<Summary>	[Variables Total 2; I		
3														
4														
5														
6	431.88	428	419.08	508.5059	512.0902	515.8745	519.2588	522.8431	526.4274		1. TPES; G%(.8/3.87); [=206.788+0.01			
7														
8	450.08	452.63	4552.22	4808.951	4881.882	4718.413	4771.144	4825.875	4880.808		2. GDP; G%(1.87/1.17); [Linear Tren			
9														
10														
11														
12														

25

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References

Macro-economics: Nominal GDP and Real GDP

Nominal gross domestic product is defined as the **market value of all final goods and services** produced in a geographical region, usually a country. **That market value depends on two things: the actual quantities of goods and services produced and their respective prices.**

When it is adjusted for price changes (inflation or deflation), the nominal GDP will be transformed into Real GDP. *Real GDP is a nation's total output of goods and services, adjusted for price changes (that is **in constant prices**).*

$$NGDP = \sum (p_t \times q_t)$$

NGDP Nominal GDP

p_t **Prices of current year**

q_t Quantities of current year

$$RGDP = \sum (p_b \times q_t)$$

RGDP Real GDP

p_b **Prices of base year**

q_t Quantities of current year

If a set of real GDPs from various years are calculated, each using **the quantities from its own year, but all using the prices from the same base year**, the differences in those real GDPs will reflect only differences in volume.

Mathematic Formula (1)

1. Regression Analysis by use of time-series data

$$E = f(I, PE)$$

E: Energy Demand

I: Income (Production), + factor

PE: Energy Price, - factor

2. Energy Intensities

$$EL_i = a_i \cdot Y_i$$

$$FU_i = b_i \cdot Y_i$$

$a_i = EL_i / Y_i$. (a_i : electricity intensity to activity level (Y_i))

$b_i = FU_i / Y_i$ (b_i : fuel intensity to activity level (Y_i))

3. Share function

$$FU_{ij} (\text{fuel } j) = FU_i \cdot S_{ij}$$

S_{ij} : Share of each energy source

$$S_{ij} = f(P_{ij} / P_i)$$

P: Energy price

Mathematic Formula (2)

<General energy intensities>

1) Industrial sector

Intensity (i, j) = Energy consumption (i, j) / Production (i, j)

i = type of industry

j = sources of energy (fuels and electricity)

2) Residential & commercial sector

Intensity (j) = Energy consumption (j) / Household

Intensity (j) = Energy consumption (j) / Floor space

j = sources of energy (fuels and electricity)

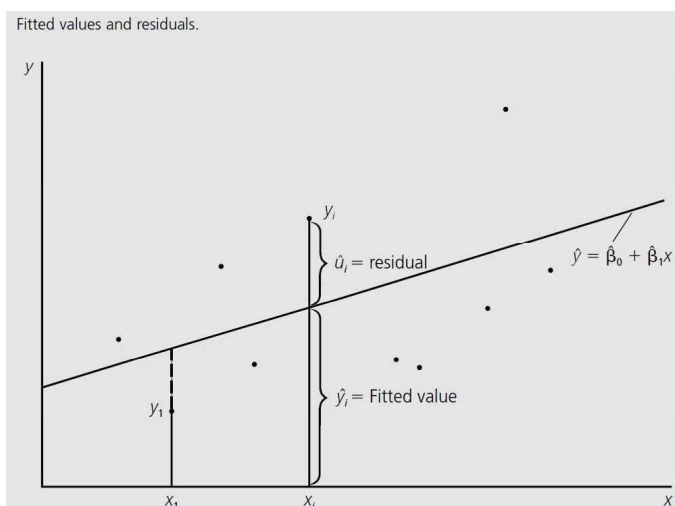
3) Transportation sector

Intensity of passenger transportation = Energy consumption (j) / passenger-km

Intensity of freight transportation = Energy consumption (j) / ton-km

j = sources of energy (fuels and electricity)

R-Squared: Goodness of fit



Total sum of squares $SST = \sum_{i=1}^n (y_i - \bar{y})^2$
Sample variation in y_i

Explained sum of squares $SSE = \sum_{i=1}^n (\hat{y}_i - \bar{y})^2$
Sample variation in \hat{y}_i

Residual sum of squares $SSR = \sum_{i=1}^n \hat{u}_i^2$
Sample variation in \hat{u}_i

R-squared is defined as:

$$R^2 = SSE / SST = 1 - SSR / SST$$

- ◆ *The ratio of the explained variation compared to the total variation*
- ◆ *R-squared=1 indicates that the data points all lie on the same line (OLS provides a perfect fit to the data). R-squared nearly equals to zero indicates a poor fit of the OLS line.*

t-value: The test of significance

$$y = \beta_0 + \beta_1 x_1 + \dots + \beta_k x_k + u$$

Once $x_1, x_2, \dots, x_{j-1}, x_{j+1}, \dots, x_k$ have been accounted for, whether x_j has a partial effect on the value of y (In fact, it is the testing of the null hypothesis: $H_0 : \beta_j = 0$)

$|t| \geq 2$ ($t \leq -2$ or $t \geq 2$) : Significant
The factor x_j has significant influence on the value of y

$2 > |t| \geq 1$ ($-2 < t \leq -1$ or $1 \leq t < 2$) : Admissible to use
The factor x_j has an influence on the value of y

$|t| < 1$ ($-1 < t < 1$) : Insignificant
The factor x_j has no influence on the value of y

Durbin-Watson test:

What happens if there are auto-correlations among error terms

To test the whether there is autocorrelation or not.

$$DW = \frac{\sum_{t=2}^n (\hat{u}_t - \hat{u}_{t-1})^2}{\sum_{t=1}^n \hat{u}_t^2} \quad y_t = \beta_0 + \beta_1 x_{t1} + \dots + \beta_k x_{tk} + u_t$$

If $DW=2$ ($1 < DW < 3$), we say there **is no** autocorrelation;

If DW is near 0 or 4, we say there **is** autocorrelation.

Sometimes, autocorrelations occur because the model is not “correctly” specified.

For example, some important variables that should be included in the model are not include;

Or the model has the wrong functional form – a linear model is fitted whereas a log-linear model should have been fitted.

Thank you!

**Training for Capacity Building on
IPP Project Evaluation (JICA)**

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**WG3 Demand Forecast
Material 4**

**~Electric Power Demand Forecasting
Models for Cambodia~part 1**

**20~24 December 2021
Asiam Research Institute, Inc.
CHEW CHONG SIANG**

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Contents

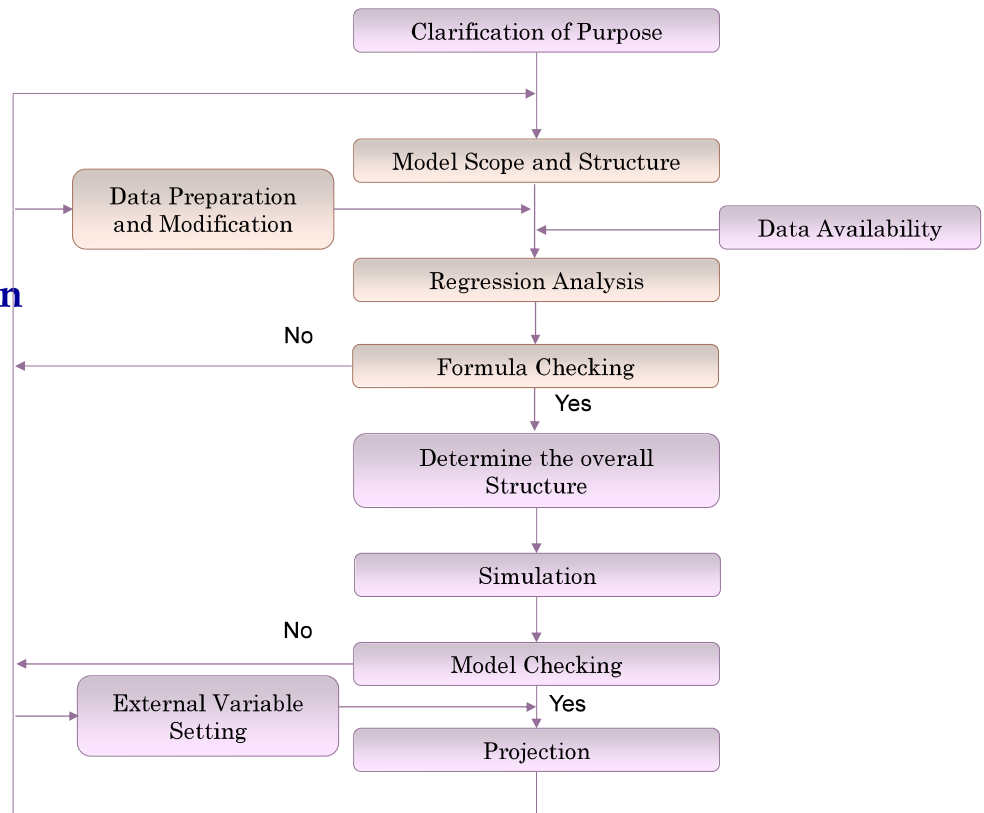
Part 1

- 1. Method**
- 2. Structure of model**
- 3. Data preparation**
- 4. Macroeconomic sub-model**
- 5. Price Scenario**

1. Method

1.1 Procedure

- 80% of the time is spent on data collection.

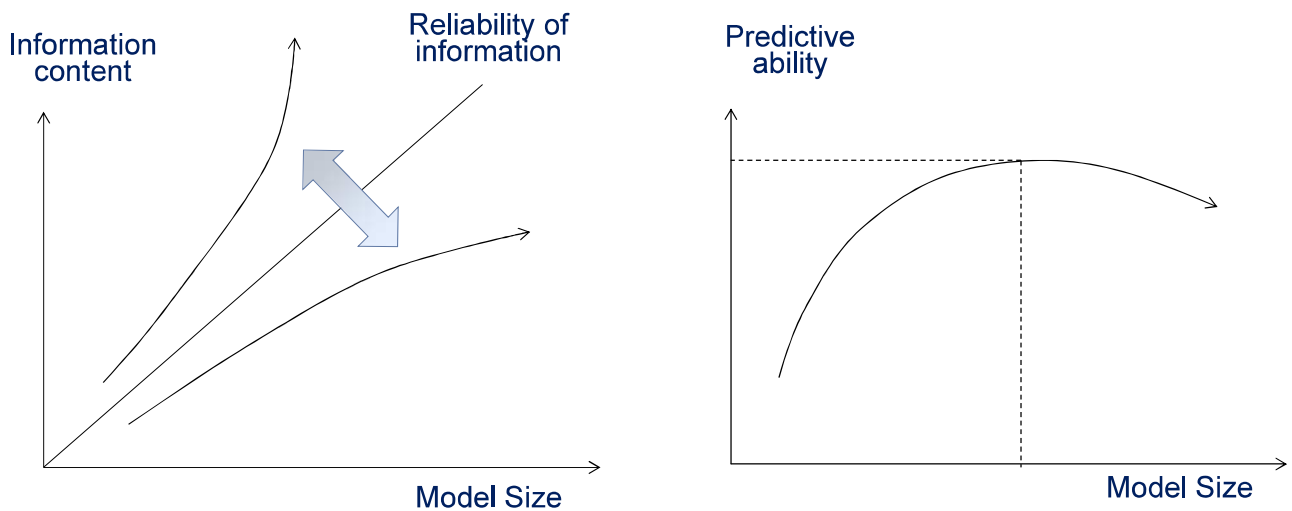


1.2 Model scope Setting

Preparation for model development;

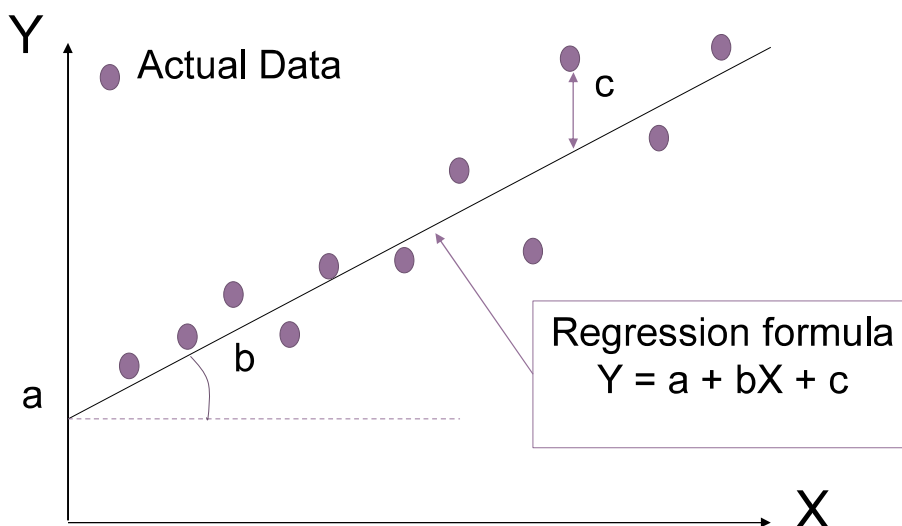
1. Purpose of model building
2. Data availability
3. How far we need the explanation from the model?
4. It is necessary to clarify what should be handled in the model and what should be given outside the model. (External or internal)
5. Analysis tool (Software)
6. Methodology (Econometric? Simulation?)

1.3 Size of Model



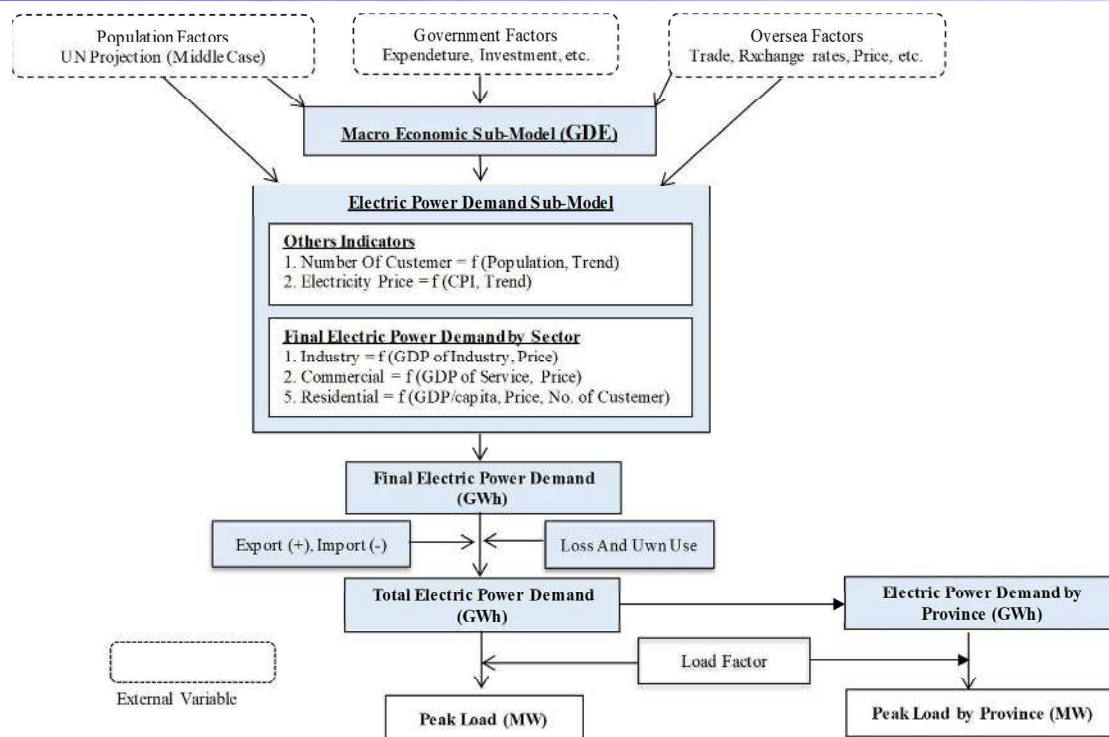
- (1) Extending the model will increase the amount of information, but does not increase predictability.
- (2) An appropriate model size is desirable. A compact one is good.

1.4 Approach – Econometric model analysis (simulation)



- Ordinary Least Squares (OLS) – Linear least squares method for estimating the unknown parameters (a, b) in a linear regression model by minimizing the sum of the squares of c.

2. Structure of Model



3. Data Preparation

(1) GDP

Available source

- Statistics Department in Cambodia (Central Bank)
- Ministry of Finance
- International Organization: ADB, WB, IMF, UNSTAT

(2) Population

- National Institute of Statistics
- United Nations Population Division

(3) Energy Data

- National Power Company (EDC)
- Electricity Authority Cambodia (EAC)
- Ministry of Mines and Energy (MME)

4. Macro-economic Sub-Model

- Calculation Process for GDP by sector
- Population



External Variable

Macro economic Block					
Urban population		POPU			lag1.POPU
Rural population		POPR	=		100-POPU
GDP at constant 2010 prices in National currency					
Gross Domestic Product (GDP)		GDPR			
Household consumption expenditure		CP	\$TG	GDPR/PO	dum.2009 lag1.CP
General government final consumption expenditure		CG	\$CA		lag1.CG
Gross fixed capital formation		IF	\$CA		(lag1.CP+ FDI
Changes in inventories		J	=		lag1.J
Exports of goods and services		E	\$CA, \$DL		lag1.E
Imports of goods and services		M	\$CA	IF	E EXC
Share of GDP Component					
Agriculture		GDP.AGS	\$CA		ln(TREND)
Industry		GDP.INS	\$CA		ln(TREND)
Services, etc.		GDP.SES	\$CA		ln(TREND)
Others		GDP.OTS	\$CA		ln(TREND)
Total		GDP.TLS	=		100
Real GDP					
Agriculture		AGR	=		GDPR*(GDP.AGS/GDP.TLS)
Industry		INR	=		GDPR*(GDP.INS/GDP.TLS)
Services, etc.		SER	=		GDPR*(GDP.SES/GDP.TLS)
Others		OTR	=		GDPR*(GDP.OTS/GDP.TLS)

5. Price Scenario

- 1) We used inflation and the consumer price index (CPI) as a price variable because the time when we creating this model, we are failed to collect the time series of electricity prices.
- 2) We assume the inflation rate will increase annually 3% until 2030.

Price Scenario					
Inflation		INFL	=		3
Inflation, consumer prices (annual growth)		CPI	=		lag1.CPI*(1+INFL/100)
Inflation, GDP deflator (annual growth)					
Electricity Prices					
Industry					
Residential					
Commercial					
Others					

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IPP Project Evaluation (JICA)**

Asiam

**WG3 Demand Forecast
Material 5**

~Electric Power Demand Forecasting Models for Cambodia~part 2

20~24 December 2021
Asiam Research Institute, Inc.
CHEW CHONG SIANG

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Contents

Part 2

- 1. Electric power demand sub-model**
- 2. Examining model formulas**
- 3. Simulation and confirmation of final results**

6. Electric Power Demand Block

Below shows the system equation in each demand sector. Basically, system equations by sectors were created as the following functional relations.

1. Industrial (Manufacturing) Sector

Electricity demand = $f(\text{GDP of Industry}, \text{Price for industry})$

2. Commercial, Public service and other Sector

Electricity demand = $f(\text{GDP of Commercial}, \text{Price for commercial})$

3. Residential Sector

Number of customer = $f(\text{electrification ratio})$

Electricity demand = $f(\text{electricity consumption/customer}, \text{price of households}, \text{number of customer})$

- Losses: Transmission and distribution losses
- Own use in electricity, CHP and Heat plants

Electric power Block						
Final consumption by sector	FCEL	=	INEL+REEL+CMEL			
Industry total (manufacturing, construction and non-f	INEL	\$CA, \$DL	INR	lag1.INEL		
Residential	REEL	\$CA, \$DL	POP	Lag1.REE	CPI	
Commercial, public services and others	CMEL	\$DL	SER	CPI	lag1.CMEL	
Own use in electricity, CHP and heat plants	OWN	=	FCEL*0.025			
Losses	LOSS	=	lag1.LOSS*(1+14/100)			
Export	EXEL	=	0			
Total Electricity Demand	TLEL	=	INEL+REEL+CMEL+OWN+LOSS+EXEL			
	NOCUS		lag1.NOCUS			

6. Examining model

Formula Checking, Simulation, Verification and confirmation of final results.

(1) Industrial Sector

➤ Regression formula:

$$\text{LN (INEL)} = 1.49(2) + 0.24(2.34) * \text{LN(INR)} \\ + 0.73(6.99) * \text{LN(LAG 1.INEL)} + 0.07(2.79) * \text{DUM.2010}$$

Where, R square = 0.956

Durbin Watson Ration = 1.82

INR = Industry GDP

INEL = Electricity demand in industry sector

Dum.2010 = Dummy year 2010

LAG 1.INEL = Previous year INEL

➤ \$DL = Double logarithmic function

(3) Domestic Sector

Regression formula:

$$\text{REEL} = -6525(-0.38) + 14399(3.36) * \text{GDPR/POP} - 12603500(-2.32) * \\ \text{REELP/CPI} + 0.83(11.9) * \text{LAG 1.REEL} - 13332(-2.07) * \\ \text{DUM.2016}$$

Where, R square = 0.977

Durbin Watson Ration = 1.89

POP = Population

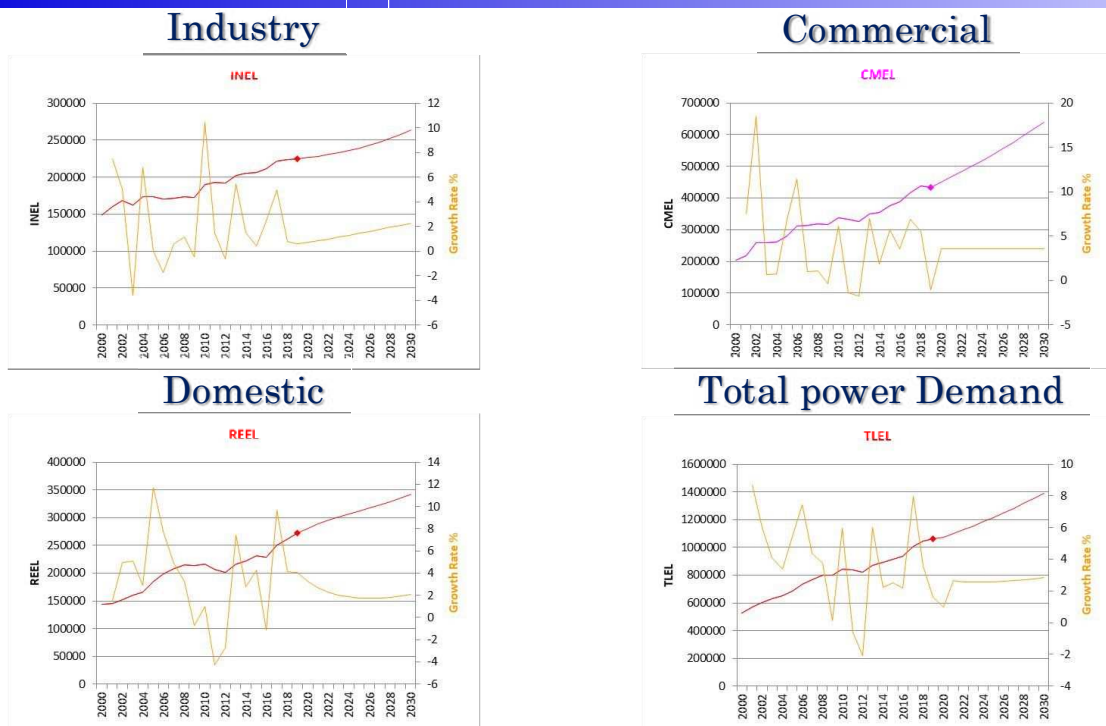
REEL = Electricity demand in domestic sector

LAG 1.REEL = Previous year REEL

REELP = Domestic Tariff

CPI = Consumer Price Index

7. Simulation



8. Electric Power Demand by Provinces

(1) GDP

Available source

- Statistics Department in Cambodia (Central Bank)
- Ministry of Finance
- International Organization: ADB, WB, IMF, UNSTAT

(2) Population

- National Institute of Statistics
- United Nations Population Division

(3) Energy Data

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Inflation, consumer prices (annual growth)		CPI	=	lag1.CPI*(1+INFL/100)	
Inflation, GDP deflator (annual growth)					
Electricity Prices					
Industry					
Residential					
Commercial					
Others					

WG3 Demand Forecast

~Method and structure of model~ OJT-Material 1

**16 February 2022
Asiam Research Institute, Inc.
CHEW CHONG SIANG**

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OJT-Contents

Material 1 - Method and structure of model

Material 2 - Electricity demand analysis

Material 3 - Model evaluation

Material 4 - Projection

Material 1

Method and structure of model

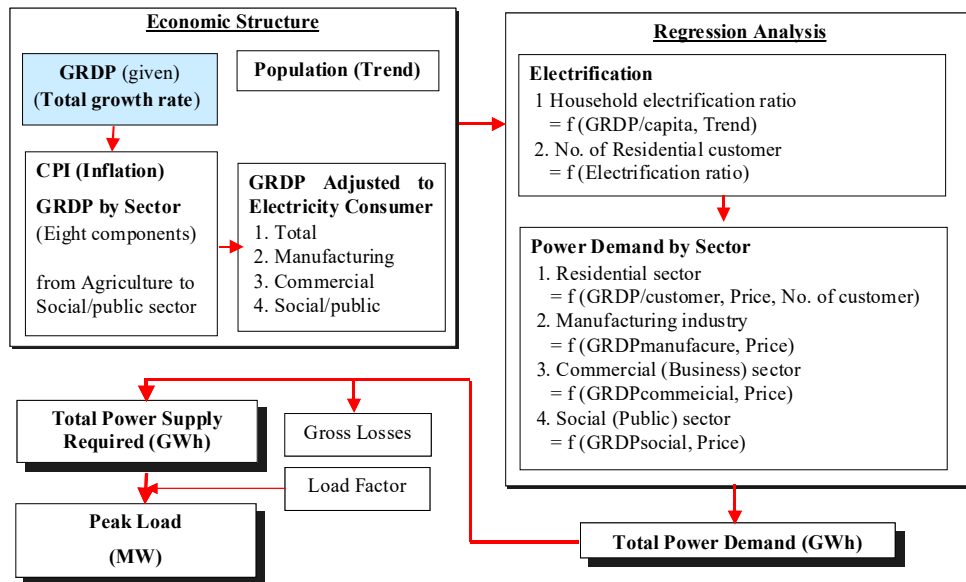
1. The Type of Energy Model
2. Method
3. Structure of Model
4. Data Preparations
5. Exercises

4

1. The Type of Energy Model

Types	Purpose of Use			Our Challenge
	Evaluation of Measures		Scenario	
	Technology	System and Economy		
a. Optimization	MARKAL Heafele/IES	ETA-MACRO Global 2100	CETA	
b. Econometric		Jorgenson-Wilcoxon OECD/GREEN	NEMS (US/DOE) FUGI	
c. Simulation				
(1) Bottom-Up			MEDEE (IEEJ) ECMP (IEEJ)	
(2) Market Equilibrium		Edmonds-Refly IEA Model		
(3) System Dynamic			Roman Club/World III	

1.1 Example-1; Regional Power Demand Model (Japan)

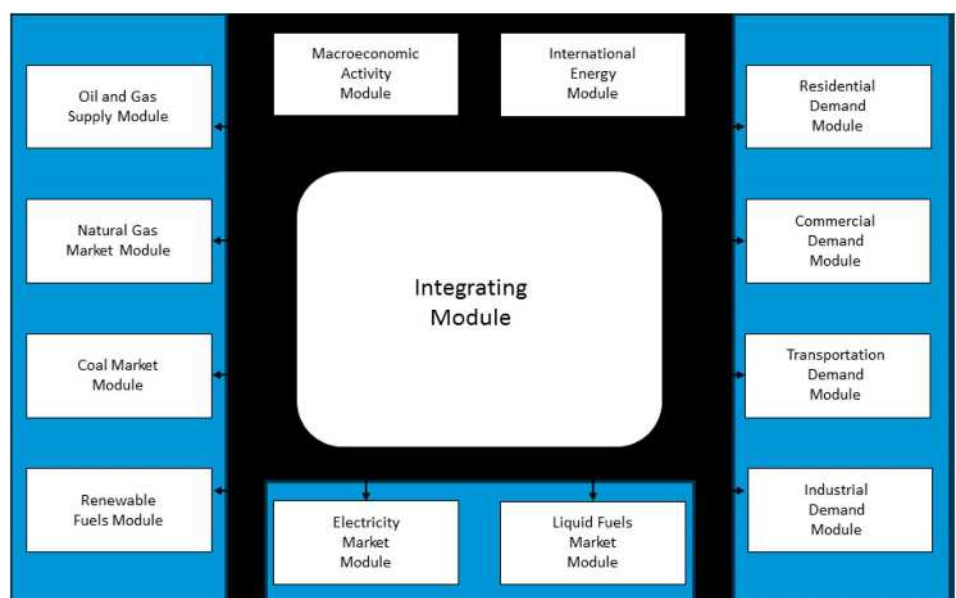


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1.2 Example-2.1; US EIA US National Energy Modeling System (NEMS)

NEMS

1. Represents the behavior of energy markets and their interactions with the U.S. economy.
2. Reflects market economics, industry structure, and existing energy policies and regulations that influence market behavior.
3. Consists of 13 modules: integrating module provides the mechanism to achieve a general market equilibrium among all the other modules.



Source; US EIA NEMS Overview 2018, <https://www.eia.gov/outlooks/aeo/nems/documentation/>

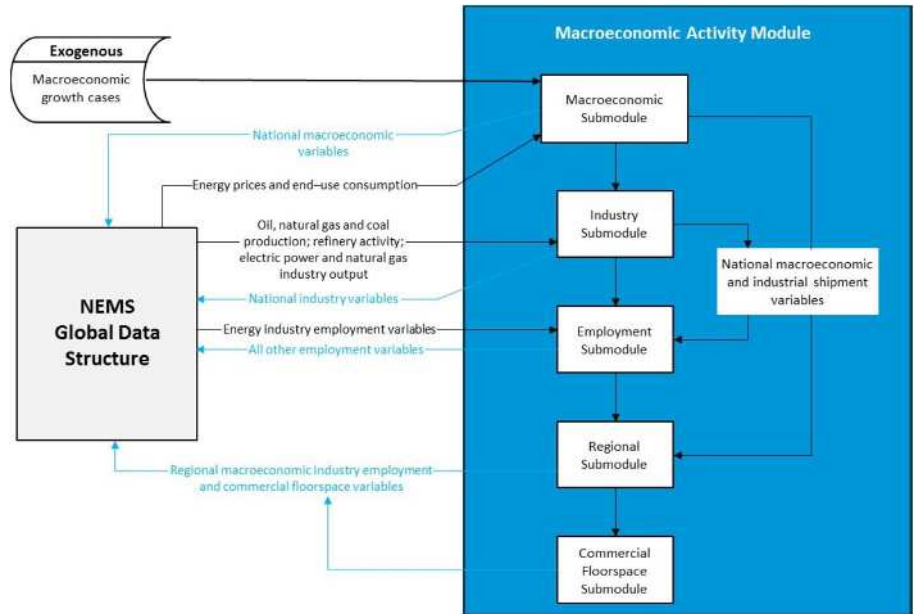
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1.2 Example-2-2; US EIA

NEMS-Macroeconomic Activity Module

MAM Structure

1. MAM links NEMS to the rest of the economy by providing projections of economic driver variables for use by the supply, demand, and conversion modules of NEMS.
2. NEMS employs the IHS Markit Ltd. model of the U.S. economy in the EViews environment.
3. All of the MAM models are linked to provide a fully integrated approach to estimating economic activity at the national, industrial and regional levels.



Source; US EIA NEMS Overview 2018, <https://www.eia.gov/outlooks/aeo/nems/documentation/>

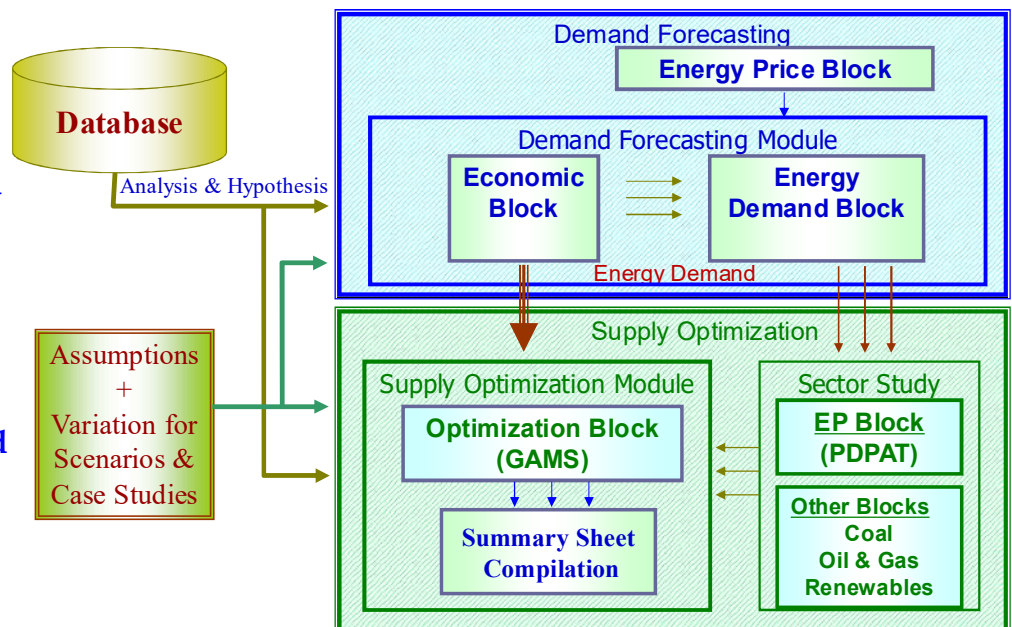
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1.3 Example-3; IEEJ Model

for the Philippine Energy Plan (PEP)

IEEJ Model for PEP

1. Model comprises demand module developed on Simple-E and supply module applying GAMS.
2. Energy demand is forecast first by the demand module.
3. Against the projected demand outlook, energy supply is optimized by the supply module.

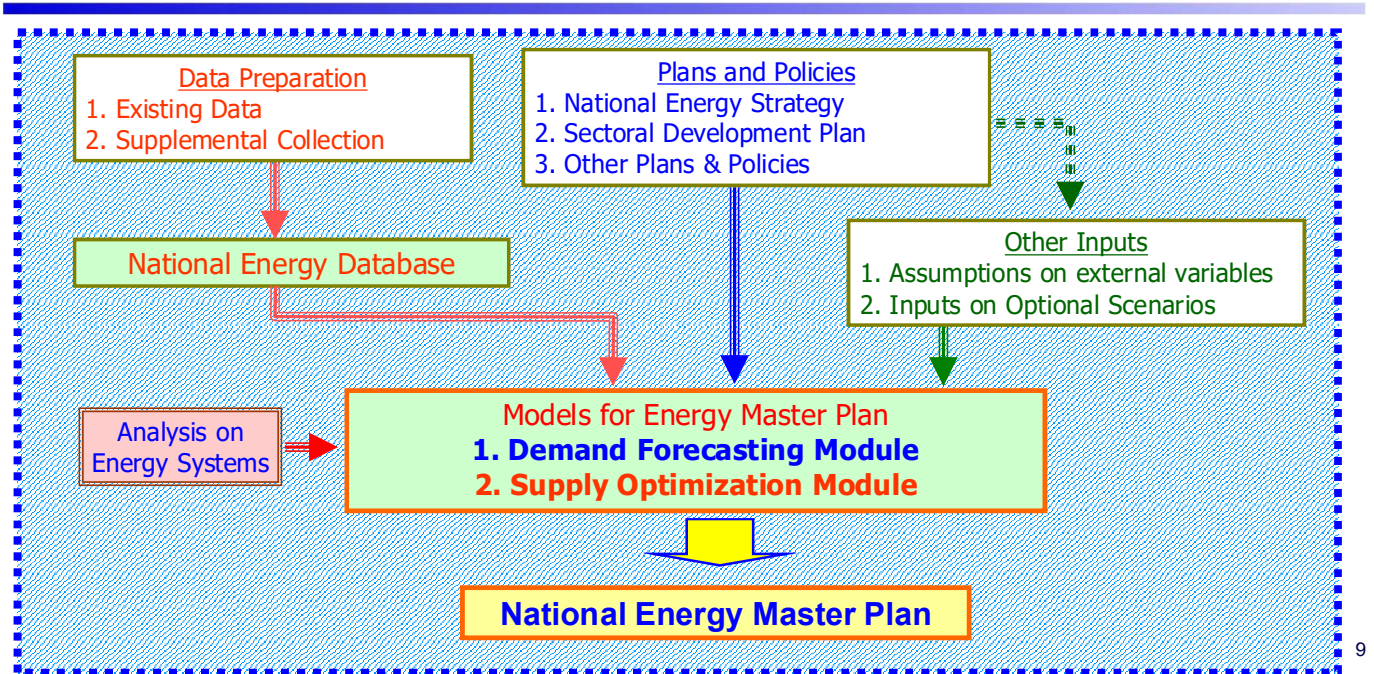


Source; IEEJ/TEPCO "JICA Study on Philippine Energy Plan Formulation", 2008

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1.4 Example-4; IEEJ Model

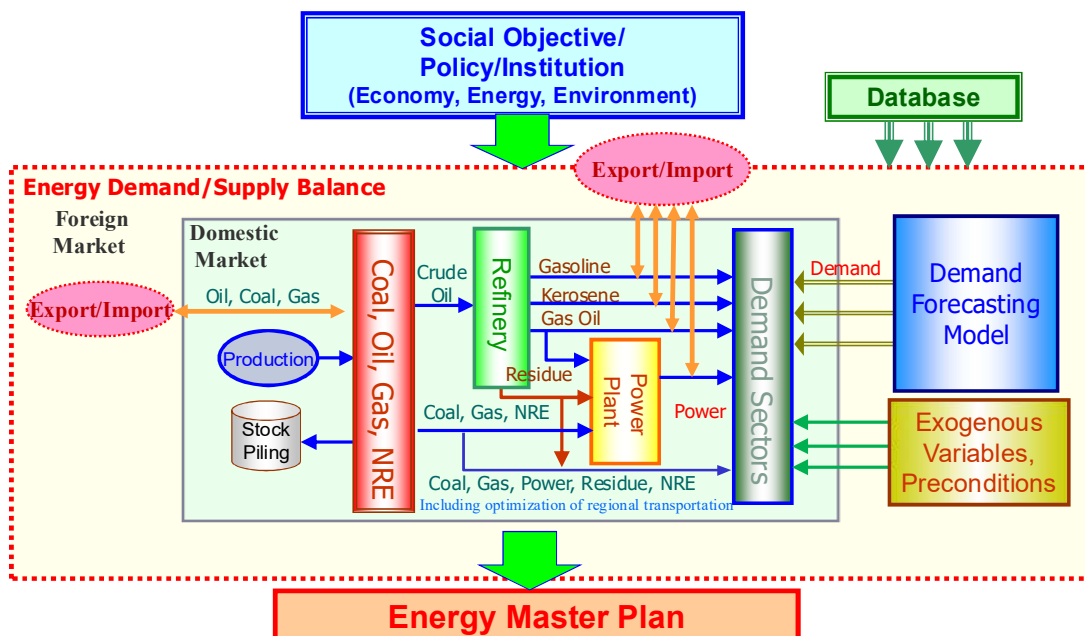
Data Flow



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1.4 Example-4; IEEJ Model

Structure of Supply Optimization Module

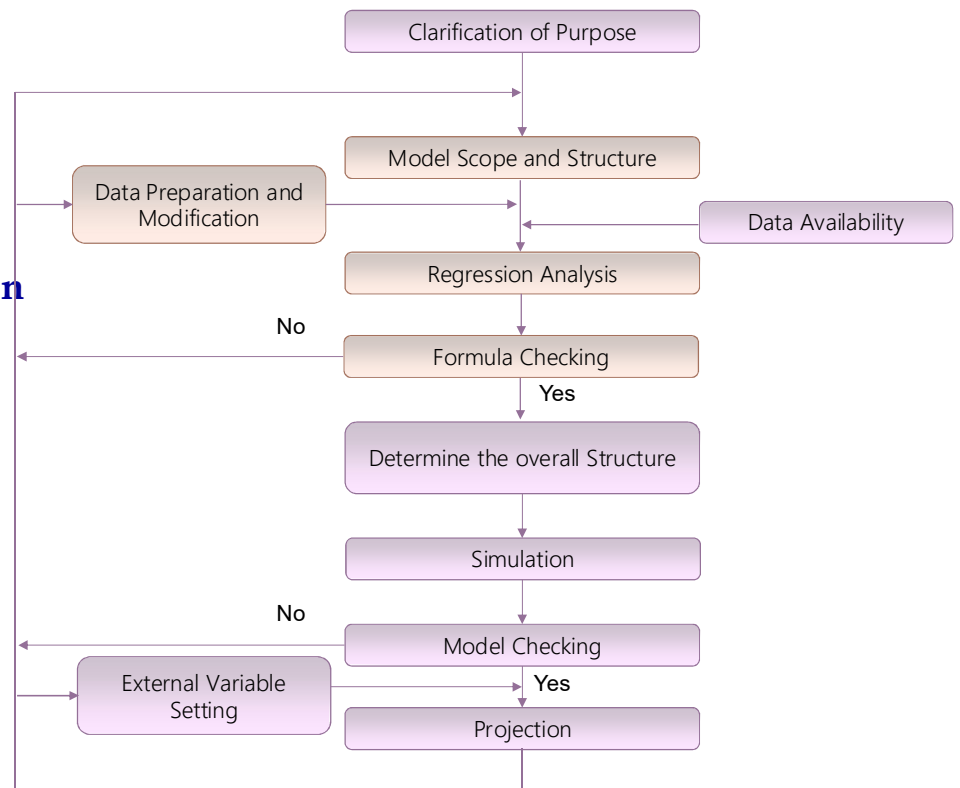


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2. Method

2.1 Procedure

- 80% of the time is spent on data collection.

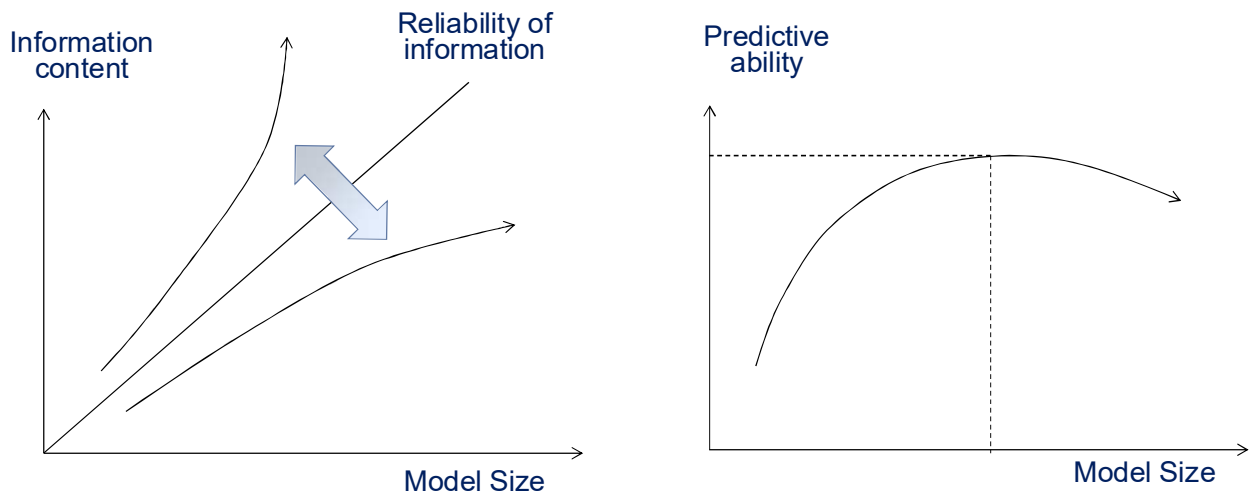


2.2 Model scope Setting

Preparation for model development;

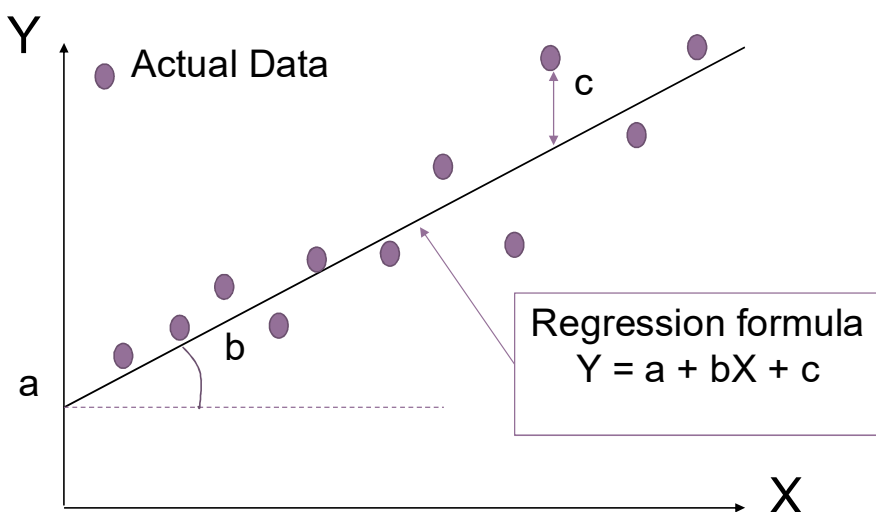
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2.3 Size of Model



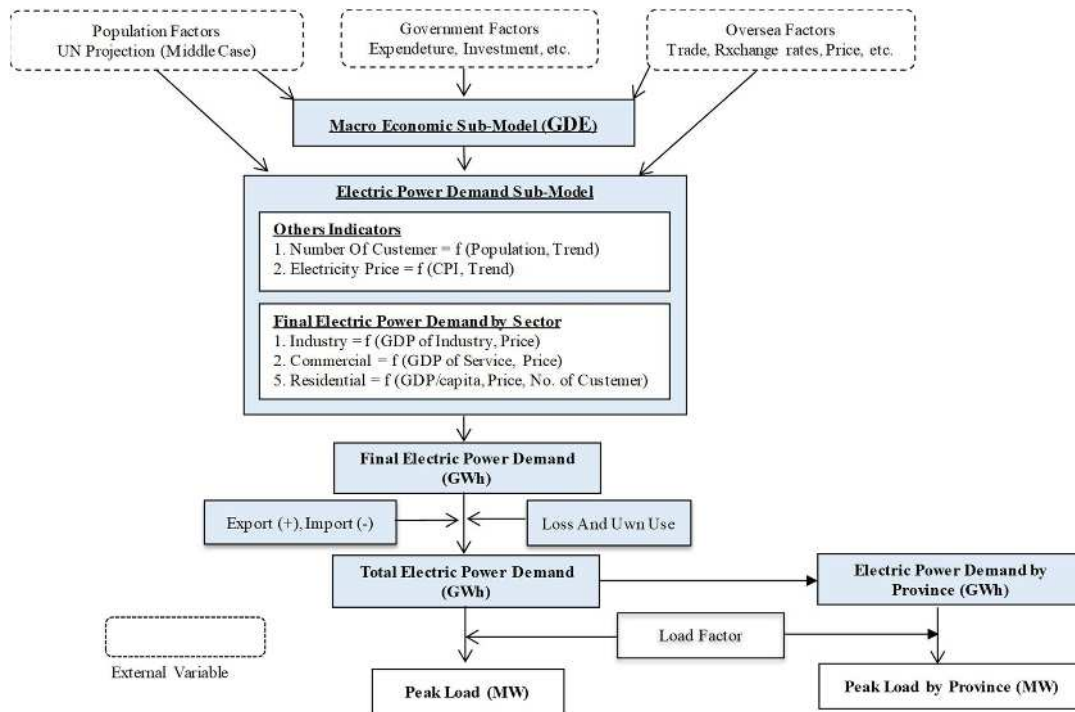
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- (2) An appropriate model size is desirable. A compact one is good.

2.4 Approach – Econometric model analysis (simulation)



- Ordinary Least Squares (OLS) – Linear least squares method for estimating the unknown parameters (a, b) in a linear regression model by minimizing the sum of the squares of c.

3. Structure of Model



4. Data Preparations

(1) GDP

Available source

- Statistics Department in Cambodia (Central Bank)
- Ministry of Finance
- International Organization: ADB, WB, IMF, UNSTAT

(2) Population

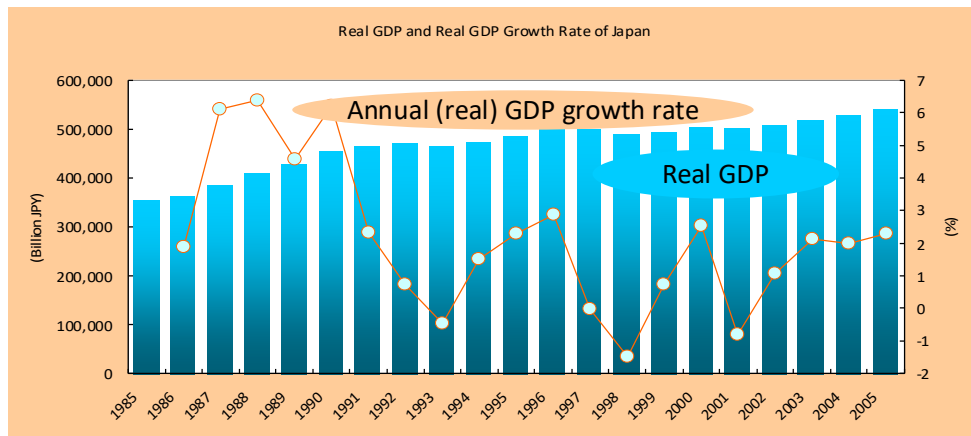
- National Institute of Statistics
- United Nations Population Division

(3) Energy Data

- National Power Company (EDC)
- Electricity Authority Cambodia (EAC)
- Ministry of Mines and Energy (MME)

5. Exercises

Macro-economics: Real GDP Growth Rate



Definition of GDP growth rate

$$RGDP_{growthrate}_t = \frac{(RGDP_{t+1} - RGDP_t)}{RGDP_t} \times 100\%$$

How to calculate the RGDP of the next year given the

RGDP of this year and the expected GDP (real) growth rate:

$$RGDP_{t+1} = RGDP_t \times (1 + RGDP_{growthrate}_t)$$

Macro-economics: Nominal GDP and Real GDP

Nominal gross domestic product is defined as the **market value of all final goods and services** produced in a geographical region, usually a country. **That market value depends on two things: the actual quantities of goods and services produced and their respective prices.**

When it is adjusted for price changes (inflation or deflation), the nominal GDP will be transformed into Real GDP. *Real GDP is a nation's total output of goods and services, adjusted for price changes (that is in constant prices).*

$NGDP = \sum(p_t \times q_t)$
 NGDP Nominal GDP
 p_t Prices of current year
 q_t Quantities of current year

$RGDP = \sum(p_b \times q_t)$
 RGDP Real GDP
 p_b Prices of base year
 q_t Quantities of current year

If a set of real GDPs from various years are calculated, each using **the quantities from its own year, but all using the prices from the same base year**, the differences in those real GDPs will reflect only differences in volume.

WG3 Demand Forecast

~ Electricity demand analysis ~ O&T-Material 2

28 February 2022
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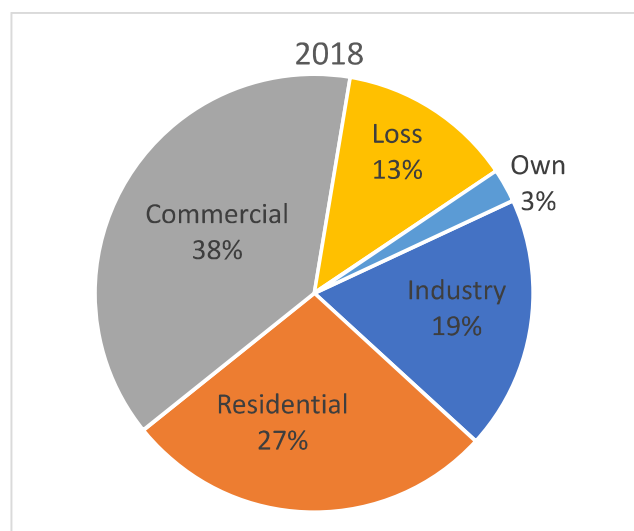
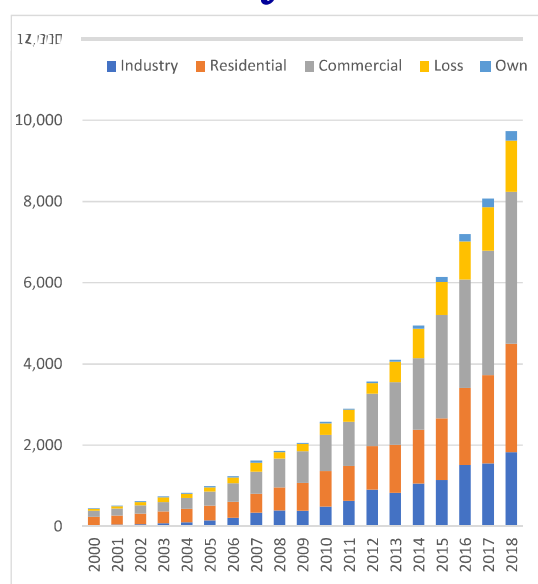
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Material 2 Electricity demand analysis

1. Structure of electricity demand
2. Current condition
3. Provinces

1. Structure of electricity demand

1.1 Electricity demand by sector



1.2 Electricity demand by sector – Growth Rate

	Industry	Residential	Commercial	Loss	Own	Total
2001	21.6	10.0	18.1	12.0	13.3	13.9
2002	35.0	16.1	17.8	51.8	14.7	22.2
2003	25.9	13.9	15.1	34.1	12.8	18.2
2004	38.5	11.3	17.7	-8.8	9.1	13.0
2005	35.7	12.5	28.6	2.9	16.7	19.6
2006	50.2	6.3	29.7	32.7	25.0	24.2
2007	56.8	17.9	22.1	52.1	57.1	31.3
2008	15.1	25.6	26.6	-24.1	-45.5	14.7
2009	-0.3	18.5	11.9	8.5	-13.3	10.7
2010	26.1	27.4	14.3	60.7	11.5	24.9
2011	28.6	-1.7	21.6	3.5	6.9	12.9
2012	42.9	26.4	18.1	-11.5	35.5	23.1
2013	-8.9	9.9	20.2	90.5	23.8	15.0
2014	28.6	11.5	14.3	43.7	73.1	20.7
2015	7.8	15.4	43.8	13.0	43.3	24.1
2016	33.1	24.3	4.9	15.6	44.2	17.2
2017	2.3	14.7	14.9	14.7	12.8	12.1
2018	18.0	22.7	22.0	17.5	15.3	20.7
Average	25.8	16.4	21.1	20.9	17.8	19.9

Electricity demand (2000-2018)

Average Growth: 19.9%

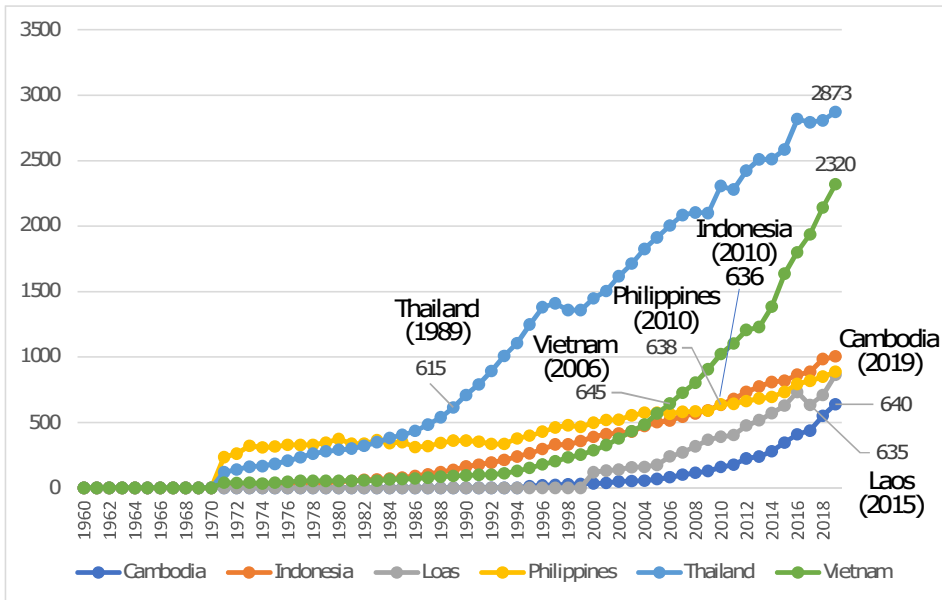
- Growth very fast
- All Sector

Points;

- When the peak coming?
- Analyses each of the sector find the key driver
- How to take care the Loss

2. Current Condition

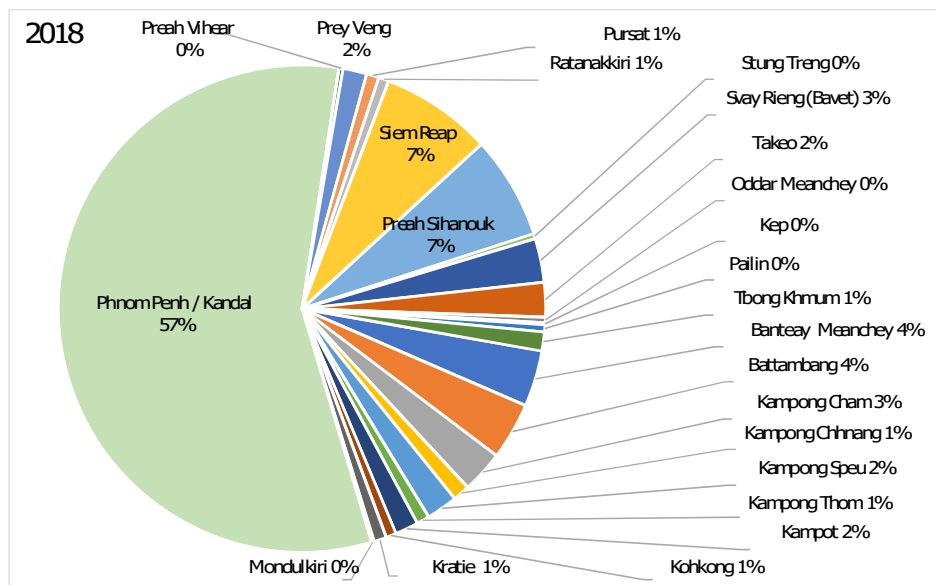
2.1 Electricity consumption/population (kWh per capita)



- Compare to neighboring country
 - kWh per capita
 - GDP per capita
 - Electricity demand growth
- Exploring future development potential
- Conform the growth Pattern for Cambodia

5

3. Provinces



Phnom Penh: 57%
Siem Reap: 7%
Preah Sihanouk: 7%
Total three: 71%

Next Step:
Focus on above three provinces to construct a demand modeling for provinces.

WG3 Demand Forecast - OJT

Material 3 - Model evaluation

Material 4 - Projection

28 February 2022
Asiam Research Institute, Inc.
CHEW CHONG SIANG

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Material 3 - Model Evaluation

3.1 Function Forms

3.2 Fitness of Equation by Regression Analysis

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4.1 Scenario Setting for Model Analysis

Material 3 – Model Evaluation

3.1 Function Forms

Typical functional forms written in the model sheet

G	H	I	J	Internal Y	Option Type	X1	X2	X3	X4	X5
Typical Functional Form										
				FNEL	GDP					
				FNEL	GDP		lag1.FNEL			
				FNEL	\$DL	GDP				
				FNEL	\$SL	GDP				
				FNEL	LN(GDP)					
				FNEL	\$DL	GDP	lag1.FNEL			
				FNEL	\$DL	GDP	lag1.FNEL	exp(TREND)		
				Ln(FNEL)		LN(GDP)	LN(PRICE)			
				FNEL	=	EXP(Ln_FNEL)				
				FNEL	GDP	PRICE				
				FNEL	GDP	PRICE	lag1.FNEL			
				FNEL	\$DL	GDP	PRICE			
				FNEL	\$SL	GDP	PRICE			
				FNEL	LN(GDP)	LN(PRICE)				
				FNEL	LN(GDP)	PRICE				
				FNEL	\$DL	GDP	PRICE	lag1.FNEL		
				FNEL	\$DL	GDP	PRICE	lag1.FNEL	exp(TREND)	

3.2 Fitness of Equation by Regression Analysis

- 1) R R-Square, $0 \leq \text{Explained variance} / \text{Total variance} \leq 1$, (The larger the better)
- 2) AR Adjusted R-Square, $AR \leq 1$, (The larger the better)
- 3) SD Standard Deviation: $SD = (\sum e^2 / (n-k))^{1/2}$,
e = Residual, n = Sample size,
k = Number of independent variables
- 4) DW Durbin Watson Statistics, $1 < DW < 3$
DW = 2 : No serial correlation
DW → 0 : Positive correlation
DW → 4 : Negative correlation
- 5) Dh Durbin h Statistics with lag, $| Dh | < 2$
- 6) t-value $| t | \geq 2$: Significant
 $2 > | t | \geq 1$: Admissible to use
 $| t | < 1$: Insignificant
- 7) Rho Coefficient of serial correlation, $| Rho | < 1$
- 8) DF Degree of Freedom, $DF > 1$ (The larger the better)
- 9) F F-value, F-Statistic: $F > 0$ (The larger the better)
- 10) RSS Residual Sum of Square, $RSS > 0$, (The smaller the better)
- 11) YX Correlation Coefficient between Y and Xs, $| YX | < 1$
- 12) XX Correlation Coefficient between Xs, $| XX | < 0.95$

3.3 Modeling by Sector

(1) Industrial

Electricity demand of industry sector (INEL)

$$= \text{Industry GDP (GDPIN)} + (\text{Electricity tariff (INELP)/Index Price(CPI)})$$

Example;

$$\ln(\text{INEL}) = -16.67 (-4.48) + 1.49 (7.22) * \ln(\text{GDPIN}) - 0.76 (-2.75) * \ln(\text{INELP/CPI})$$

Where, R square = 0.93

Durbin Watson ratio = 1.17

5

(2) Residential

Calculation for Number of customer

CUST (Number of customer)

$$= (\text{Population/Number of Family}) * \text{Electrification ratio}$$

Electricity demand of Residential (REEL)

$$= \text{GDP/Number of customer (CUST)} + (\text{Electricity tariff (REELP)/Index Price(CPI)} + \text{Number of customer(CUST)})$$

Example;

$$\ln(\text{REEL}) = -6.36 (-6.92) + 0.47 (6.79) * \ln(\text{GDP/CUST}) - 0.28 (-7.23) * \ln(\text{REELP/CPI}) + 0.49 (6.95) * \ln(\text{CUST}) + 0.69 (12.8) * \ln(\text{lag1.REEL})$$

Where, R square = 0.99

Durbin Watson ratio = 2.39

6

(3) Commercial

Electricity demand of Commercial (CMEL)

= Commercial GDP (GDPCM) + (Electricity tariff (CMELP)/Index price (CPI))

$\ln(\text{CMEL}) = -25.72 (-8.08) + 1.91 (11.2) * \ln(\text{GDPCM}) - 0.699 (-5.35) * \ln(\text{CMELP/CPI})$

Where, R square = 0.98

Durbin Watson ratio = 1.36

7

(4) Public

Electricity demand of Public (PUEL)

= Public GDP (GDPPU) + (Electricity tariff (PUELP)/Index Price (CPI))

Example;

$\ln(\text{PUEL}) = -2.78 (-2.81) + 0.28 (3.67) * \ln(\text{GDPPU}) - 0.80 (-3.24) * \ln(\text{PUELP/CPI})$

Where, R square = 0.99

Durbin Watson ratio = 2.24

8

Material 4 – Projection

4.1 Scenario Setting for Model Analysis

1. Scenarios may be set corresponding to the future socio-economic outlook, social targets and policy options, which are considered difficult or inappropriate for forecasting by the model.
2. In general energy/environment analysis, scenarios are set on future development of socio-economic elements; such as population growth rate, economic growth rate, crude oil prices, currency exchange rate, monetary/fiscal policies, industrial structure change, energy structure target (energy conversion, energy import/export), energy tariff options, energy efficiency target, GHG emissions target, new/renewable energy introduction policy, environmental policies, etc.
3. A scenario for model analysis comprises a set of assumptions and projections numerically expressed on these elements.

(1) Scenario Setting by Data Sheet; Projection of Variables

1. Scenarios should be prepared in numerical values and given to the model as a set of **projected external variables** in the “Data” sheet.
2. For case studies, different scenarios may be examined changing the projection for variables and running the model for each such set.

14	15	16	17	18	19	20	21	22	23	24	25	26
1998	1999	2000	2001	2002	2003	2004	2005	2006	2007	2008	2009	2010
167	180	188	196	208	218.4	229.32	240.786	252.8253	265.4666	278.7399	292.6769	307.3107
239.7	258	281.7	288.2	313.6								
51014291	57998089	65341135	66035016	73560041								
380	380	380	420	420								
1.59	1.47	1.35	1.46	1.34								
Actual values					Scenario							

(2) Scenario Setting by Model Sheet; Defining Equations

Scenarios are also set by defining the relationship of variables

shown by equations and values of parameters.

GDP Share						
	Industry		%	SHIN	\$CA	LN(TREND)
	Commercial		%	SHCM	\$CA	LN(TREND)
	Public		%	SHPU	\$CA	LN(TREND)
	Others		%	SHOT	\$CA	LN(TREND)
	for adjustment to total 100 %			SHTL	=	SHIN+SHCM+SHPU+SHOT
GDP	GDP Growth rate		%	(External) GR	=	4.5
	Total (Scenario)			(External) GDP	=	lag1.GDP*(1+GR/100)
	Industry			(External) GDPIN	=	GDP*(SHIN/SHTL)
	Commercial			(External) GDPCM	=	GDP*(SHCM/SHTL)
	Public			(External) GDPPU	=	GDP*(SHPU/SHTL)
	Others			(External) GDPOT	=	GDP*(SHOT/SHTL)
CPI			1995=100	CPI	=	lag1.CPI*(1+INFL/100)
Inflation			%	(External) INFL	=	GR*1.2
Price Scenario (Real Value Constant)						
	Industry		/kWh	PINEL	=	lag1.PINEL*(1+INFL/100)
	Residential		/kWh	PREEL	=	lag1.PREEL*(1+INFL/100)
	Commercial (Business)		/kWh	PCMEL	=	lag1.PCMEL*(1+INFL/100)
	Public		/kWh	PPUEL	=	lag1.PPUEL*(1+INFL/100)

Model Manual

for

Electric Power Demand Forecasting

Models for Cambodia

By CHEW, Chong Siang

JICA Team

May 2022

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Notes

- This manual is based on data that can be collected at the current condition. As more data becomes available, the model can be flexibly expanded and improved in accuracy.
- The model has been simplified in its structure to make it easier for the novice to understand. This structure can be easily modified and rewritten to fit Cambodia's reality.

I. Explanation of Models

1. General

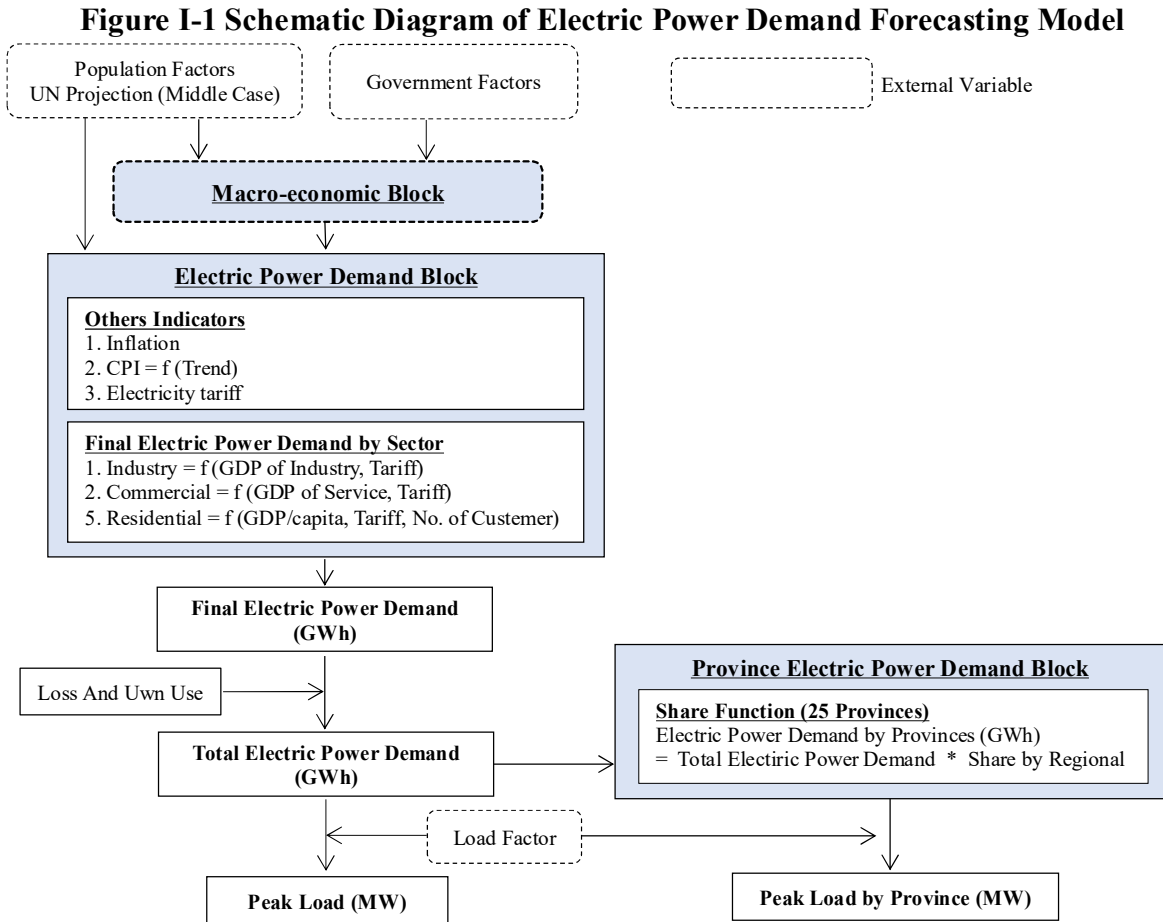
1.1 Concept of electric power demand forecasting model for Cambodia

(1) Type of model and approach

This is an econometric model base on regression analysis method and applying various assumption. The macro indicator assumption like economic growth, population growth, price index and inflation are used as preconditions to reflect the macroeconomic policy of the Cambodian government.

(2) Schematic Diagram

The Electric power demand forecasting model consists of a macro-economic block, electric power demand block, and province electric power demand block as shown in Figure I-1. The model computes electric power demand by sector of the electric power demand block, using economic indices obtained from the macro-economic model block. The total electric power demand will divide by provinces by the historical ratio change in the province electric power demand block.



1.2 Code Name

Naming of code (abbreviations) is left to modeler's discretion. Generally, the first two characters will be using to create a code name. As a reference, an example is shown in Figure I-2. In this case, sector classification is the first two characters and energy classification are the second two characters, however, such kind of rule is basically free. The code must be easily recognizable and simple.

Figure I-2 An Example of Code Name

Items	Code Name
Population	POP
Gross domestic product	GDP
Agriculture, forestry, and fishing	AG
Industry	IN
Services	SE
Consumer prices Index	CPI
Electricity	EL
Price	P
Electricity consumption by sector	
Industry	INEL
Commercial	COEL
Residential	REEL

2. Calculation Process of Electricity Demand Forecasting Model

2.1 Macro-economic Block

In this case, macro indicators consist of three items, that is, (1) population, (2) GDP by sector and (3) consumer price index. In the electricity demand forecasting, former items described above are treated as external valuables in order to simulate the impact of price and GDP growth.

Notes:

Future extensions to the model will include sectoral additional data on electricity tariffs, number of customers, and electrification rates to improve the accuracy of the model. The current model will construct by framework with a limited data at the current condition.

(1) Macro Indicators (Assumptions)

Figure I-3 shows the system equations for macro-indicators (POP, GDP, CPI and Inflation). Share of classified sectors (GDP.TLS) and each share of GDP (GDP.AGS, GDP.INS, GDP.SES, and GDP.OTS) is not regression analysis. These equations are taken into consideration an economic structure change based on the historical trend. In case that we don't consider the structure change, we can fix the share or we can calculate the moving average. If we want to introduce structure change scenario, we can put our scenario into "Data" sheet directly.

In this case, the population and GDP data are set in the “Data” sheet from 2000 until 2020. After 2020 until 2030, population growth rate is given as 1.4% and GDP is given as 6.0% in the “Model” sheet.

Figure I-3 Macro-indicators (“Model” Sheet)

Macro Block				
Total population		POP	=	lag1.POP*(1+1.4/100)
GDP by share (Constant 2000)				
Agriculture, forestry, and fish	%	GDP.AGS	\$CA	LN(TREND)
Industry	%	GDP.INS	\$CA	LN(TREND)
Services, etc.	%	GDP.SES	\$CA	LN(TREND)
Others	%	GDP.OTS	\$CA	LN(TREND)
Total	%	GDP.TLS	=	GDP.AGS+GDP.INS+GDP.SES+GDP.OTS
GDP (Constant 2000)				
GDP growth rate	%			
Agriculture, forestry, and fish	KR Billion	AGR	=	GDPR*(GDP.AGS/GDP.TLS)
Industry	KR Billion	INR	=	GDPR*(GDP.INS/GDP.TLS)
Services, etc.	KR Billion	SER	=	GDPR*(GDP.SES/GDP.TLS)
Others	KR Billion	OTR	=	GDPR*(GDP.OTS/GDP.TLS)
Real GDP	KR Billion	GDPR	=	lag1.GDPR*(1+6/100)

Notes:

lag1: Previous year data

LN: Logarithm

(2) Price Scenario (Assumptions)

Figure I-4 shows the price scenario in the “Model” sheet. Prices are up with inflation (real value constant) if the cells in “Data” sheet” are blank. In this case, inflation is given as 3% in the “Model” sheet. CPI will alternative the electricity tariff as a price scenario in this model. For future revision, please input the electricity tariff in the “Data” sheet and setting the price scenario by the sectoral electricity tariff (turn the red color to black).

Notes:

In “Model” sheet, if we turn the character to red color, simple-e will stop to make the calculation in that part.

Figure I-4 Price Scenario (“Model” Sheet)

Price Block				
Inflation		INFL	=	3
Consumer Price Index		CPI	=	lag1.CPI*(1+INFL/100)
Electricity Distribution - Weighted Average				
Domestic Tariff (residential)	Ush/kWh	ELP.RE	=	lag1.ELP.RE*(1+INFL/100)
Commercial Tariffs	Ush/kWh	ELP.COM	=	lag1.ELP.COM*(1+INFL/100)
Large Industrial Tariff	Ush/kWh	ELP.IN	=	lag1.ELP.IN*(1+INFL/100)

2.2 Electric Power Demand Block

Electric power demand block comprising of each sector creates the system equations by sector and calculates sectoral demand and the total. The demand function is estimated by regression analysis in each sectoral demand for industry (INEL), residential (REEL), commercial (CMEL, included the government/public sectors). The total demand (TLEL) is obtained by adding the sectoral demand after included the own use (OWN, consumption in power plant) and losses (LOSS, transmission and distribution).

(1) System Equations in Power Sector Block (“Model” sheet)

Figure I-5 shows the system equations in each demand sector. Basically, system equations by sector were created as the following functional relations.

1) Industry sector

$$\text{Electricity demand} = f(\text{GDP of industry, Price for industry})$$

2) Residential sector

$$\text{Number of customers} = f(\text{Electrification ratio})$$

$$\text{Electricity demand} = f(\text{Electricity consumption/Customer, Price for households, Number of customers, Previous year's demand})$$

3) Commercial sector

$$\text{Electricity demand} = f(\text{GDP of commercial, Price for commercial sector})$$

In this training, we will simplify the functions as figure I-5 because of the data on electricity rates, number of customers, and electrification rates were not collected. Please try to revise the model by above equations when your success to collect those data.

Own use and losses are set as assumption. Own use is given as 2.5% of final consumption by sector and losses is given as 6.0% annual growth. Total electricity demand will include the INEL, REEL, CMEL, OWN, and LOSS.

Figure I-5 System Equation in Electric Power Demand Block (“Model” Sheet)

Electric power Block						
Final consumption by sector	FCEL	=		INEL+REEL+CMEL		
Industry	INEL	=	\$CA_\$DL INR	lag 1.INEL		
Residential	REEL	=	\$CA_\$DL POP	lag 1.REEL	CPI	
Commercial	CMEL	=	\$DL SER	CPI	lag 1.CMEL	
Own use in electricity, CHP and heat plants	OWN	=		FCEL*0.025		
Losses	LOSS	=		lag 1.LOSS*(1+6/100)		
Export	EXEL	=		0		
Total Electricity Demand	TLEL	=		INEL+REEL+CMEL+OWN+LOSS+EXEL		

As an example, equations obtained by the regression analysis are as follows.

1) Industry sector

$$\text{LN (INEL)} = -3.5977 (-2.66) + 0.6038 (2.96) * \text{LN (INR)} + 0.7153 (8.06) * \text{LN (LAG1.INEL)}$$

Where, R square = 0.994

Durbin Watson ratio = 2.16

2) Residential sector

$$\text{LN (REEL)} = -47.068 (-2.16) + 5.3191 (2.16) * \text{LN(POP)} + 0.4344 (1.61) * \text{LN(LAG1.REEL)} \\ - 0.007085(-0.394) * \text{LN(CPI)}$$

Where, R square = 0.995

Durbin Watson ratio = 2.09

3) Commercial sector

$$\text{LN (CMEL)} = -10.548 (-4.88) + 1.5977 (4.98) * \text{LN(SER)} - 0.0479 (-3.15) * \text{LN(CPI)} \\ + 0.3657 (2.89) * \text{LN(LAG1.CMEL)}$$

Where, R square = 0.998

Durbin Watson ratio = 2.73

Notes:

LAG1: Previous Year's Values

Values in (): t-value

(2) Peak Load (MW)

Peak load can be calculated by the following equation. The load factor is set as an assumption or scenario.

$$\text{Peak Load} = \text{Total Electricity Demand} / ((\text{Load Factor}/100) * 365 \text{ Day} * 24 \text{ Hour})$$

2.3 Province Electric Power Demand Block

In this section, the electricity demand in province is distributed into 24 areas. Phnom Penh and Kandal province will combine together as one area because of the grid system.

(1) Share of Electric Power Demand by Regional

Finally, the electric power demand is distributed to each area by province using its historical trend (logarithmic trend). Figure I-6 shows the share estimation of each province and area. These equations are not due to regression analysis. We can change these definitions if we have a scenario and policy.

Figure I-6 Share of Electric Power Demand by Provinces (“Model” Sheet)

Regional by Share (%)								
Banteay Meanchey			BTCS	\$CA	ln(TREND)			
Battambang			BTBS	\$CA	ln(TREND)			
Kampong Cham			KGCS	\$CA	ln(TREND)			
Kampong Chhnang			KGHS	\$CA	ln(TREND)			
Kampong Speu			KPSS	\$CA	ln(TREND)			
Kampong Thom			KTMS	\$CA	ln(TREND)			
Kampot			KPTS	\$CA	ln(TREND)			
Kohkong			KKGS	\$CA	ln(TREND)			
Kratie			KRTS	\$CA	ln(TREND)			
Mondulkiri			MDKS	\$CA	ln(TREND)			
Phnom Penh / Kandal			PHNS	\$CA	ln(TREND)			
Preah Vihear			PRIS	\$CA	ln(TREND)			
Prey Veng			PRVS	\$CA	ln(TREND)			
Pursat			PSTS	\$CA	ln(TREND)			
Ratanakkiri			RTKS	\$CA	ln(TREND)			
Siem Reap			SRPS	\$CA	ln(TREND)			
Preah Sihanouk			SHVS	\$CA	ln(TREND)			
Stung Treng			STRS	\$CA	ln(TREND)			
Svay Rieng (Bavet)			SVRS	\$CA	ln(TREND)			
Takeo			TKOS	\$CA	ln(TREND)			
Oddar Meanchey			ODMS	\$CA	ln(TREND)			
Kep			KEPS	\$CA	ln(TREND)			
Pailin			PALS	\$CA	ln(TREND)			
Tbong Khmum			TGKS	=	TLS-(BTCS+BTBS+KGCS+KGHS+KPSS+KTMS-			
Total		%	TLS	=	100			

(2) Electric Power Demand by Regional

Electric power demand by province and area are calculated by share.

Figure I-7 Electric Power Demand by Provinces (“Model” Sheet)

Electricity Demand by Provinces								
Banteay Meanchey			BTC	=	TLEL*BTCS/100			
Battambang			BTB	=	TLEL*BTBS/100			
Kampong Cham			KGC	=	TLEL*KGCS/100			
Kampong Chhnang			KGH	=	TLEL*KGHS/100			
Kampong Speu			KPS	=	TLEL*KPSS/100			
Kampong Thom			KTM	=	TLEL*KTMS/100			
Kampot			KPT	=	TLEL*KPTS/100			
Kohkong			KKG	=	TLEL*KKGS/100			
Kratie			KRT	=	TLEL*KRTS/100			
Mondulkiri			MDK	=	TLEL*MDKS/100			
Phnom Penh / Kandal			PHN	=	TLEL*PHNS/100			
Preah Vihear			PRI	=	TLEL*PRIS/100			
Prey Veng			PRV	=	TLEL*PRVS/100			
Pursat			PST	=	TLEL*PSTS/100			
Ratanakkiri			RTK	=	TLEL*RTKS/100			
Siem Reap			SRP	=	TLEL*SRPS/100			
Preah Sihanouk			SHV	=	TLEL*SHVS/100			
Stung Treng			STR	=	TLEL*STRS/100			
Svay Rieng (Bavet)			SVR	=	TLEL*SVRS/100			
Takeo			TKO	=	TLEL*TKOS/100			
Oddar Meanchey			ODM	=	TLEL*ODMS/100			
Kep			KEP	=	TLEL*KEPS/100			
Pailin			PAL	=	TLEL*PALS/100			
Tbong Khmum			TGK	=	TLEL*TGKS/100			
Total			TL	=	BTC+BTB+KGC+KGH+KPS+KTM+KPT+KKG+I			

II. Fundamentals for Model Building

1. General

1.1 Role of Energy Models

Energy models have various objectives such as energy development plan, energy conservation plan, and environmental protection. The results of models can establish scientific basis for comprehensive energy planning and enhance the technical capabilities of national energy use. Models linked to “Energy Balance Table” are also to help preparing available reporting system for policy making in energy sector.

A comprehensive energy database (time series Energy Balance Table) can contribute to foster the common understanding between various energy planning and implementing agencies, and plays an important role for the decision of energy policy. Forecasting energy demand is requisite for stable energy supply and for determining energy supply structure in order to achieve the best mix of energy. Figure II-1 shows the examples of energy model (sub-model) and the objectives.

Figure II-1 Examples of Energy Model (sub-model)

Model	Objective	Contribute to
Energy price model	Demand fluctuation	Price (or tax) policy
Electricity demand forecast	Long-term demand	Power development plan
Macro-economic model	Economic growth rate	Economic scenario
Energy conservation	Energy saving potential	Energy saving policy
Oil products price	Demand fluctuation	Price (or tax) policy
Energy export model	National benefit maximum	Export structure

1.2 General Approaches for Model Building

The model is required to be easy in operation and to be transparent and flexible in understanding the methodology and the logic employed. The model also should be built on a flexible system so that the user can revise the data and the model based on annual or quarterly additional data and changes of specific requirements from Government energy policy.

Speaking of energy demand forecasting methods in general, there are two different approaches. One is a process-engineering method (a kind of bottom-up system), while the other is an econometric method. Naturally each has its own advantages and disadvantages.

Regarding data collection as an example, the former involves a wide variety of data, but few time-series data. In contrast, the latter requires few data of this kind but time-series data in the long run (ten years or longer).

The results of the engineering approach are easily understood, since it will provide huge data and explanation. In case of an econometric method, however, the background of forecast results can hardly be explained in detail because macro-economic/social indicators are

incorporated as exogenous variables. With recognition of these merits and demerits, we are usually applying the econometric approach and combination of both concepts using energy intensities and efficiencies excluding intentional judgment for setting the parameters.

The characteristics of both approaches are completely different from viewpoints of several categories, such as, data collection, handling, scientific points, and results. Typical functional formula of both approaches can express as described below.

(1) Process Engineering Approach by Stock Type Demand Function

$$\text{Demand} = \text{SUM} (E_i) = S_i \cdot Q_i \cdot R_i, i = 1, n$$

E_i = energy consumption of i – equipment
 S_i = energy consuming equipment stock
 Q_i = equipment efficiency
 R_i = equipment operating rate

Taking electricity consumption in residential sector as an example, S represents the number of equipment such as refrigerator, air conditioner, lighting fixture, television, electric cooker, vacuum cleaner, electric carpet and so on. Q represents the efficiency of equipment and R represents using time of equipment. S (equipment stock), Q (efficiency) and R (availability) each has its own function that is determined from the following functional formula, for instant;

$$S_t = S_{t-1} + I_t - S_{t-1} \cdot \gamma$$

$$I_t = f(P_{it}, P_{et}, Y_t, S_{t-1})$$

$$Q_t = f(P_{et}, Q_{t-1}, T_t)$$

$$R_t = f(P_{et}, R_{t-1})$$

Where, S_{t-1} is the number of stocks in previous year or previous period. I_t is the newly purchased number and $S_{t-1} \cdot \gamma$ is the disposed number. P_{it} ; price of equipment, P_{et} ; price of energy, Y_t ; income, T_t ; time trend

(2) Economic Approach by Regression Analysis

Figure II-2 below shows the typical functional forms written in “Simple-E model sheet” as an example. In the Figure, Y (demand) is defined as internal (dependent) valuable, and X or X_i is external (independent) valuable (GNP and price etc.). Figure II-3 also shows typical demand function as an example.

Figure II-2 Typical functional forms written in “Simple-E model sheet

	Internal Y	Option Type	X1	X2	X3	X4
Typical Functional Form						
Y = a + b*X	DEMAND		GNP.R			
Y = a + b*X + c*Y(-1)	DEMAND		GNP.R	lag1.DEMAND		
LN(Y) = a + b*LN(X)	DEMAND	\$DL	GNP.R			
LN(Y) = a + b*X	DEMAND	\$SL	GNP.R			
Y = a + b*LN(X)	DEMAND		LN(GNP.R)			
LN(Y) = a + b*LN(X) + c*LN(Y(-1))	DEMAND	\$DL	GNP.R	lag1.DEMAND		
LN(Y) = a + b*LN(X1) + c*LN(Y(-1)) + d*X2	DEMAND	\$DL	GNP.R	lag1.DEMAND	exp(TREND)	
Y = a + b*X1 + c*X2	DEMAND		GNP.R	PRICE		
Y = a + b*X1 + c*X2 + d*Y(-1)	DEMAND		GNP.R	PRICE	lag1.DEMAND	
LN(Y) = a + b*LN(X1) + c*LN(X2)	DEMAND	\$DL	GNP.R	PRICE		
LN(Y) = a + b*X1 + c*X2	DEMAND	\$SL	GNP.R	PRICE		
Y = a + b*LN(X1) + c*LN(X2)	DEMAND		LN(GNP.R)	LN(PRICE)		
Y = a + b*LN(X1) + c*X2	DEMAND		LN(GNP.R)	PRICE		
LN(Y) = a + b*LN(X1) + c*LN(X2) + d*LN(Y(-1))	DEMAND	\$DL	GNP.R	PRICE	lag1.DEMAND	
LN(Y) = a + b*LN(X1) + c*LN(X2) + d*LN(Y(-1)) + e*X3	DEMAND	\$DL	GNP.R	PRICE	lag1.DEMAND	exp(TREND)

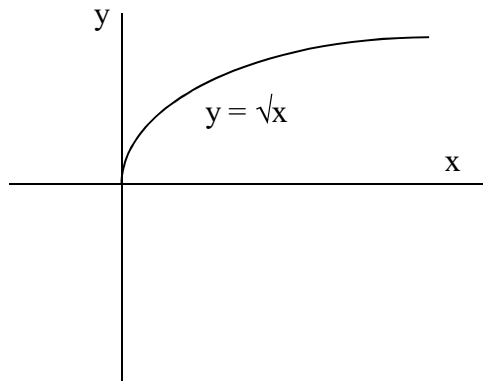
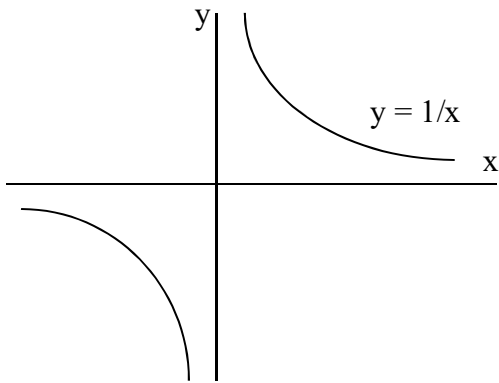
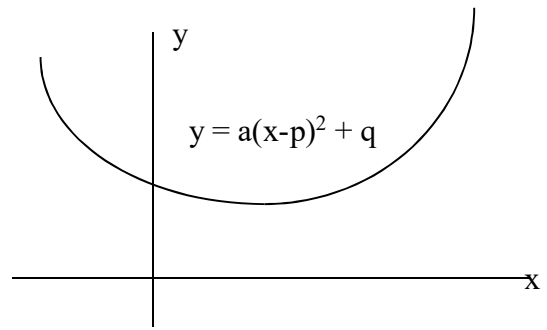
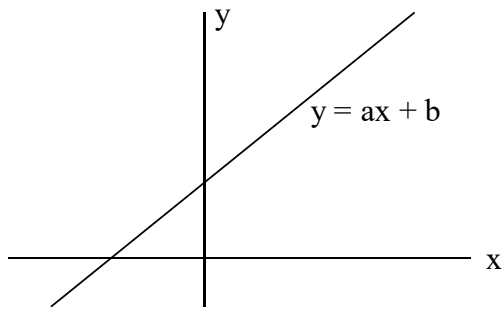
Figure II-3 Example of typical flow type demand function

<p> $LOG(D) = a + b \cdot LOG(Y) - c \cdot LOG(P) + d \cdot LOG(D(-1)) + e \cdot Time$ Y = Income Index P = Price Index D(-1) = Demand for previous year b = Income elasticity (short period) c = Price elasticity (short period) 1-d = Time adjustment term e = Technical improvement term b/(1-d) = Long term Income elasticity c/(1-d) = Long term Price elasticity </p>
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2. Determination of Demand Function

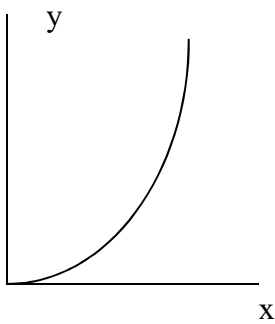
2.1 General Functional Forms

- 1) Linear function $y = ax + b$
- 2) Quadric function $y = a(x-p)^2 + q$
- 3) Fractional function $y = 1/x$
- 4) Irrational function $y = \sqrt{x}$
- 5) Power function $y = x^a$
- 6) Exponential function $y = a^x$
- 7) Logarithmic function $y = \log_a x$ (a=e, natural logarithm)

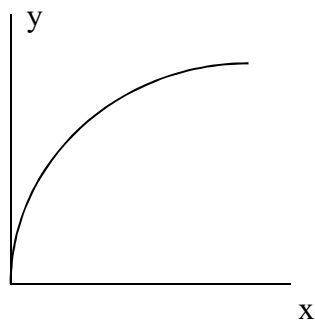


Power function $y = x^a$

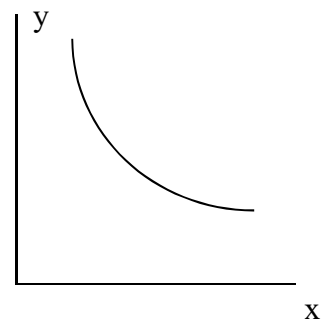
(1) $a > 1$



(2) $1 > a > 0$

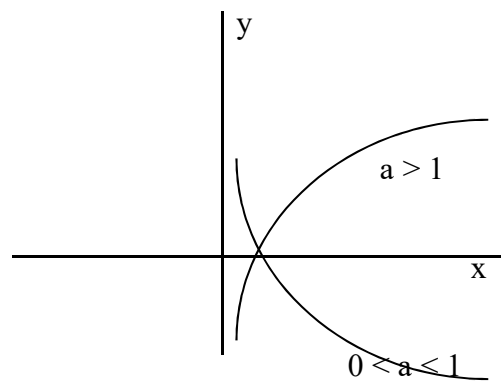
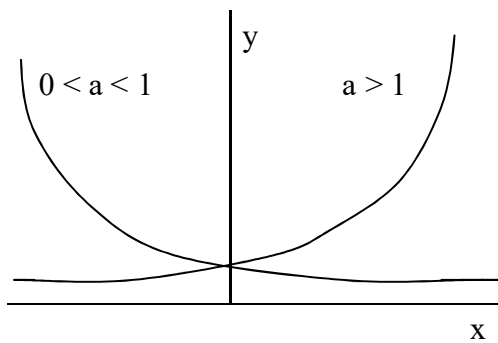


(3) $a < 1$



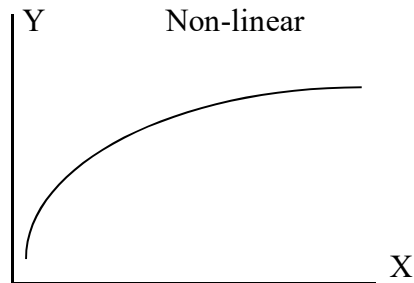
Exponential function $y = a^x$ ($a > 0$)

Logarithmic function $y = \log_a x$

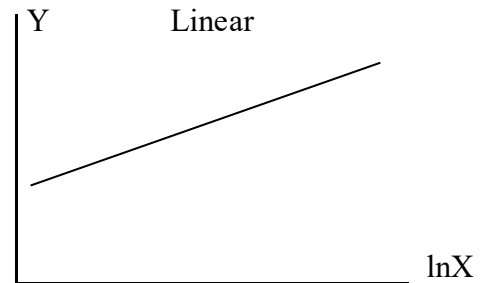


2.2 Linearization

Non-linear	Transformation	Linear	Constraints
1) $y = ax^b$	$Y = \log y, X = \log x$	$Y = a' + bX$	$x > 0, y > 0, a > 0$
2) $y = e^{a+bx}$	$Y = \log y$	$Y = a + bx$	$y > 0$
3) $y = e^{a+bx} / (1 + e^{a+bx})$	$Y = \log (y / (1 - y))$	$Y = a + bx$	$0 < y < 1$



Linear-log functional form



Graph of Y against lnX

2.3 Summary of functional forms

Model	Form	Slope	Elasticity	Ave.
Linear	$Y = a + b * X$	b	$b * (X/Y)$	Y/X
Double-log	$\ln Y = a + b * \ln X$	$b * (Y/X)$	b	Y/X
Linear-log	$Y = a + b * \ln X$	$b * (1/X)$	$b * (1/Y)$	Y/X
Log-linear	$\ln Y = a + b * X$	$b * Y$	$b * X$	Y/X
Reciprocal	$Y = a + b * (1/X)$	$-b * (1/X^2)$	$-b * (1/XY)$	Y/X
Logarithmic reciprocal	$\ln Y = a + b * (1/X)$	$-b * (1/X^2) * Y$	$-b * (1/X)$	Y/X
Quadratic	$Y = a + b * X + c * X^2$	$b + 2 * c * X$	$(b + 2 * c * X) * (X/Y)$	Y/X
Polynomial	$Y = a + b_1 X + b_2 X^2 + b_3 X^3 + \dots + b_k X^k$	$b_1 + 2 * b_2 * X + \dots + k * b_k X^{k-1}$	$(b_1 + 2 * b_2 * X + \dots + k * b_k X^{k-1}) * (X/Y)$	Y/X
Interaction	$Y = a + b * X + c * XZ$	$b + c * Z$	$(b + c * Z) * (X/Y)$	Y/X
Logistic	$\ln(Y/(1-Y)) = a + b * X$	$b * Y * (1-Y)$	$b * (1-Y) * X$	Y/X

Slope (Marginal Propensity) = dY/dX ,

Elasticity = $(dY/dX) * (X/Y)$,

Ave. (Average Propensity) = Y/X

3. Regression Analysis

3.1 Fitness of Equation by Regression Analysis

1) R	R-Square, $0 \leq \text{Explained variance} / \text{Total variance} \leq 1$, (The larger the better)
2) AR	Adjusted R-Square, $AR \leq 1$, (The larger the better)
3) SD	$SD = (\sum e^2 / (n-k))^{1/2}$, $e = \text{Residual}, n = \text{Sample size}, k = \text{No. of independent variables}$
4) DW	Durbin Watson Statistics, $1 < DW < 3$ $DW = 2$: No serial correlation $DW \rightarrow 0$: Positive correlation $DW \rightarrow 4$: Negative correlation
5) Dh	Durbin h Statistics with lag, $ Dh < 2$

6) t-value	$ t \geq 2$: Significant
	$2 > t \geq 1$: Admissible to use
	$ t < 1$: Insignificant
7) Rho	Coefficient of serial correlation, $ \text{Rho} < 1$	
8) DF	Degree of Freedom, $DF > 1$ (The larger the better)	
9) F	F-Statistics, $F > 0$ (The larger the better)	
10) RSS	Residual Sum of Square, $RSS > 0$ (The smaller the better)	
11) YX	Correlation Coefficient between Y and X's, $ YX < 1$	
12) XX	Correlation Coefficient between X's, $ XX < 0.95$	

3.2 Dummy Valuables

1) To neglect abnormal value of designated years

$$Y = a + b \cdot X + c \cdot \text{dum.1991} \quad (\text{observation year 1978-1998})$$

$$\text{In 1991, dummy} = 1, Y = (a + c) + b \cdot X$$

$$\text{Others, dummy} = 0, Y = a + b \cdot X$$

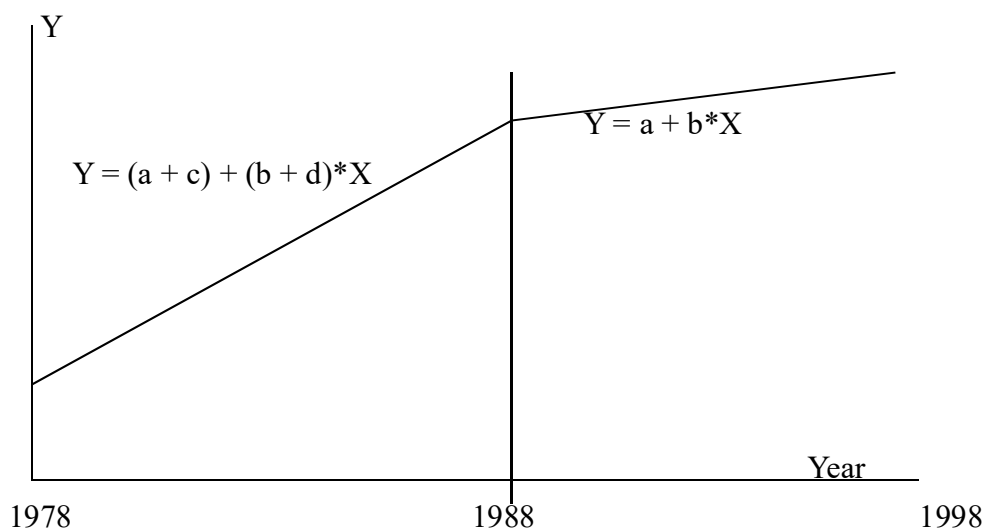
2) To consider structure change of demand function

$$Y = a + b \cdot X + c \cdot \text{dum.1978..1988} + d \cdot \text{dum.1978..1988} \cdot X$$

(observation year 1978-1998)

$$1978-1988, \text{dummy} = 1, Y = (a + c) + (b + d) \cdot X$$

$$1988-1998, \text{dummy} = 0, Y = a + b \cdot X$$



4. Elasticity and Intensity

Various energy indicators are usually used for energy demand forecasting and supply analysis. Typically, two indicators, that is, elasticity and intensity, help us easily understand the relationship between energy and economy.

4.1 Energy Demand Elasticity

Typical energy demand function is determined by income and price as same as other commodities in general. Therefore Demand (D) is function of Income (I) and Price (P).

$$D = f(I, P)$$

$$D = a \cdot I^b \cdot P^c$$

Taking logarithm of both sides,

$$\ln(D) = a + b \cdot \ln(I) + c \cdot \ln(P)$$

And by partial differentiation,

$$dD/D = b \cdot (dI/I) + c \cdot (dP/P)$$

Where, coefficient b and c mean income elasticity and price elasticity respectively.

$$b = (dD/D) / (dI/I), c = (dD/D) / (dP/P)$$

In order to understand easily, taking assumption that price index (P) is nearly constant,

$$D = a \cdot I^b, \ln(D) = a + b \cdot \ln(I)$$

Taking differentiation,

$$dD/D = b \cdot (dI/I)$$

$$b = (dD/D) / (dI/I) = ((D(t)-D(t-1)) / D(t-1)) / ((I(t)-I(t-1)) / I(t-1))$$

In this case, the above elasticity is called “gross elasticity” because price is not taken into consideration. In reality, energy demand is not determined by income alone, but depends also on price fluctuations and technological innovations. Nevertheless, this value is generally used because of long-term stability and its easiness in calculating, which is defined as coefficient b of above equation. If we use GDP as an income index, energy elasticity with respect to GDP is also defined as the ratio of growth rate (%) of energy consumption to that (%) of GDP.

Definition

$$e = (dE/E) / (dGDP/GDP) = \text{Growth rate of Energy (\%)} / \text{Growth rate of GDP (\%)}$$

where, e = elasticity with respect GDP

E = energy demand

GDP = Gross Domestic Product

4.2 General Description of Functional Forms and Elasticity

Definition of Elasticity (e)

$$Y = f(X)$$

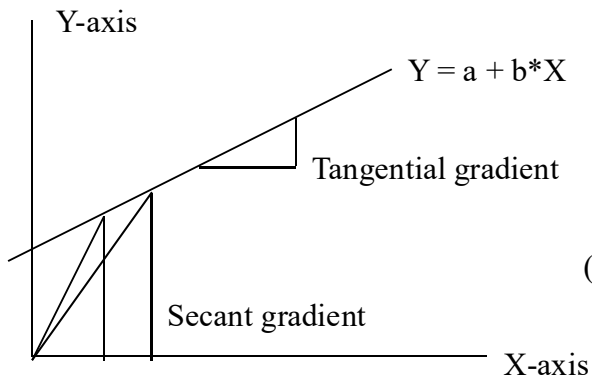
$$e = (dY/Y) / (dX/X) = (dY/dX) * (X/Y)$$

1) $Y = a + b \cdot X$

$dY/dX = b$

$e = (dY/dX) \cdot (X/Y) = b \cdot (X/Y)$,

e(elasticity) is an increase function of X/Y (share of X with respect to Y)



Elasticity $e = b \cdot (X/Y)$

$b =$ Tangential gradient

$Y/X =$ Secant gradient

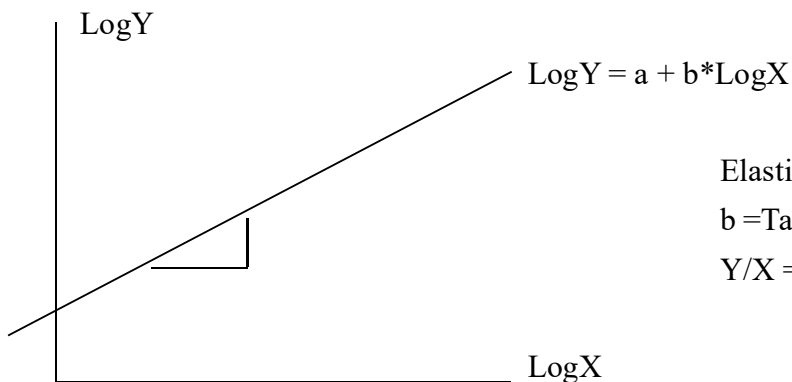
(e = increased function of X/Y)

2) $\text{Log}Y = a + b \cdot \text{Log}X$

$dY/Y = b \cdot (dX/X)$,

$e = (dY/dX) \cdot (X/Y) = b$

b : elasticity



Elasticity $e = b$ (constant)

$b =$ Tangential gradient

$Y/X =$ Secant gradient

3) $\text{Log}Y = a + b \cdot X$

$dY/Y = b \cdot dX$,

$e = (dY/dX) \cdot (X/Y) = b \cdot Y \cdot (X/Y) = b \cdot X$

e is an increase function of X

4) $Y = a + b \cdot \text{log}X$

$dY = b \cdot (dX/X)$,

$e = (dY/dX) \cdot (X/Y) = b \cdot (1/X) \cdot (X/Y) = b/Y$

e is a decrease function of Y

5) $\text{Log}Y = a + b \cdot \text{Log}X + c \cdot Z \cdot \text{Log}X$
 $dY/Y = b \cdot (dX/X) + c \cdot Z \cdot (dX/X) = (b + c \cdot Z) \cdot (dX/X),$
 $e = (dY/dX) \cdot (X/Y) = b + c \cdot Z$

6) Long-term elasticity and Short-term elasticity (Functional Foam with lag)

6.1) $Y = a + b \cdot X + c \cdot Y(-1)$

In long term, $Y = Y(-1)$, assumption in equilibrium condition

$$(1-c) \cdot Y = a + b \cdot X$$

$$Y = a/(1-c) + b/(1-c) \cdot X$$

6.2) $\text{Log}Y = a + b \cdot \text{Log}X + c \cdot \text{log}Y(-1)$

In long term, $Y = Y(-1)$, assumption in equilibrium condition

$$\text{Log}Y = a/(1-c) + b/(1-c) \cdot \text{Log}X$$

Boundary condition $c = 0$, $\text{Log}Y = a + b \cdot \text{Log}X$

$b =$ Short-term elasticity, $b/(1-c) =$ Long-term elasticity

$1-c =$ Time adjustment term, $0 \leq c < 1$

6.3) $\text{Log}Y = a + b \cdot \text{Log}X_1 + c \cdot \text{log}X_2 + d \cdot \text{log}Y(-1)$

Same above

b and $c =$ Short-term elasticity,

$b/(1-d)$ and $c/(1-d) =$ Long-term elasticity

$1-d =$ Time adjustment term, $0 \leq d < 1$

Long-term elasticity	$b = b / (1-d), \quad c = c / (1-d)$
Short-term elasticity	b and c

4.3 Energy Demand Intensity

Energy intensity is useful for international comparisons and for observing the status of energy conservation. Although the indicator was originally used for engineering, if the reciprocal is taken, energy consumption/GDP can be interpreted to indicate macro energy productivity. Energy intensity is broadly used, for example, to show per GDP energy intensity (taking GDP as the denominator) and to show per capita energy intensity (taking population as the denominator). By using various indicators as the denominator, we can introduce various energy intensities for model building.

1) Industrial sector

Intensity (i, j) = amount of energy consumption (i, j) / amount of production (i, j)

Where: i = type of business.

j = energy source (fuels and electricity)

2) Residential and commercial sector

Intensity (j) = amount of energy consumption (j) / household (residential)

Intensity (j) = amount of energy consumption (j) / floor space (commercial)

Where: j = energy source (fuels and electricity)

3) Transportation sector

Intensity (passenger) = amount of energy consumption (j) / person-km

Intensity (freight) = amount of energy consumption (j) / ton-km

Where: j = energy source (fuels and electricity)