

# Modelling of Energy Systems- Renewables and Efficiency

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# Indian Examples

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- Analysis of wind integration into power system
- PV- Battery storage – Design space
- Solar Water Heater Diffusion
- Optimal response to time of use tariff
  - process scheduling
  - cool storage
  - cogeneration
- Benchmarking of glass furnace
- Decision Support System for energy planning

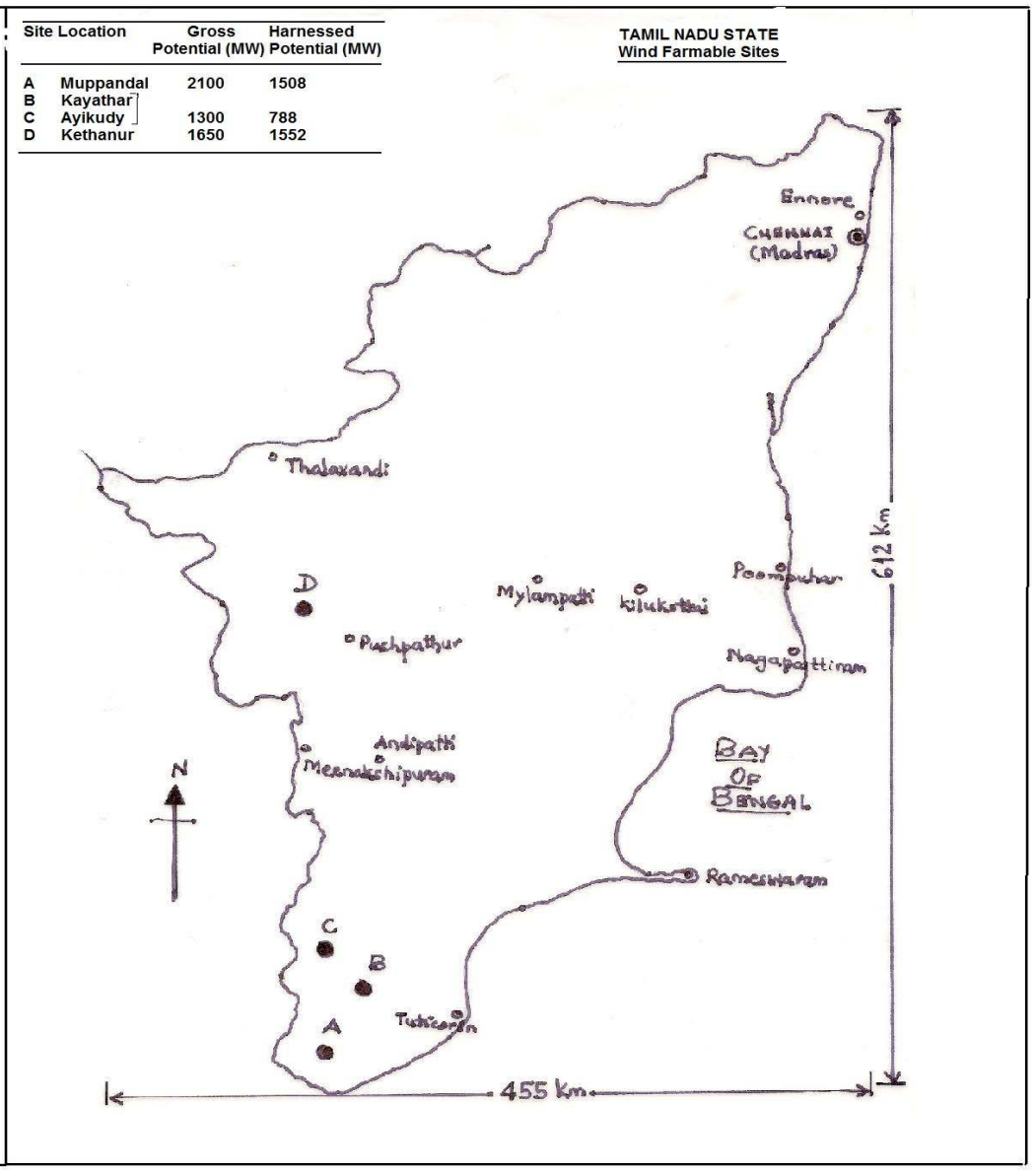
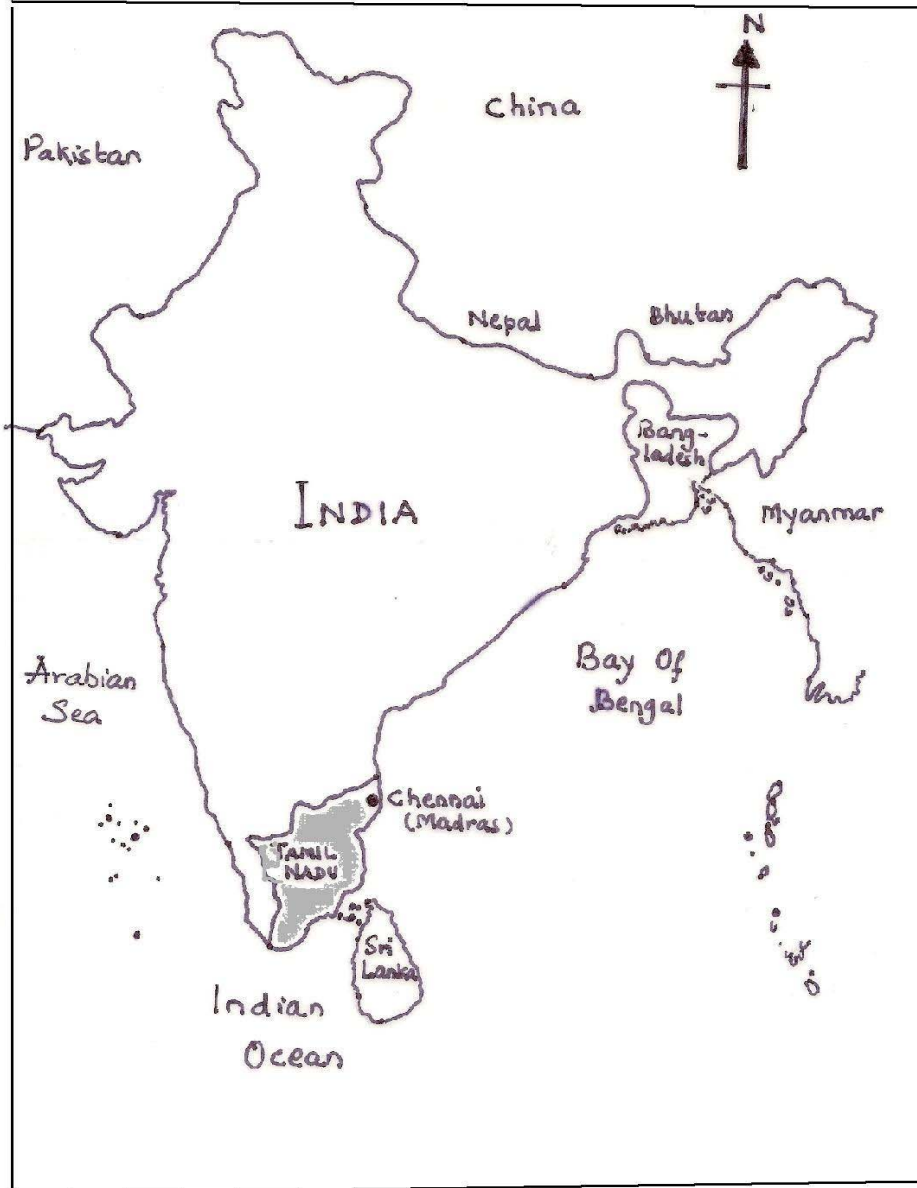


# Issues in grid integration

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- Conventional power planning- hydro-thermal scheduling
- How do we deal with renewables?
- Capacity credit
- New methodology based on Load Duration Curve
- Illustrated for Wind in Tamil Nadu

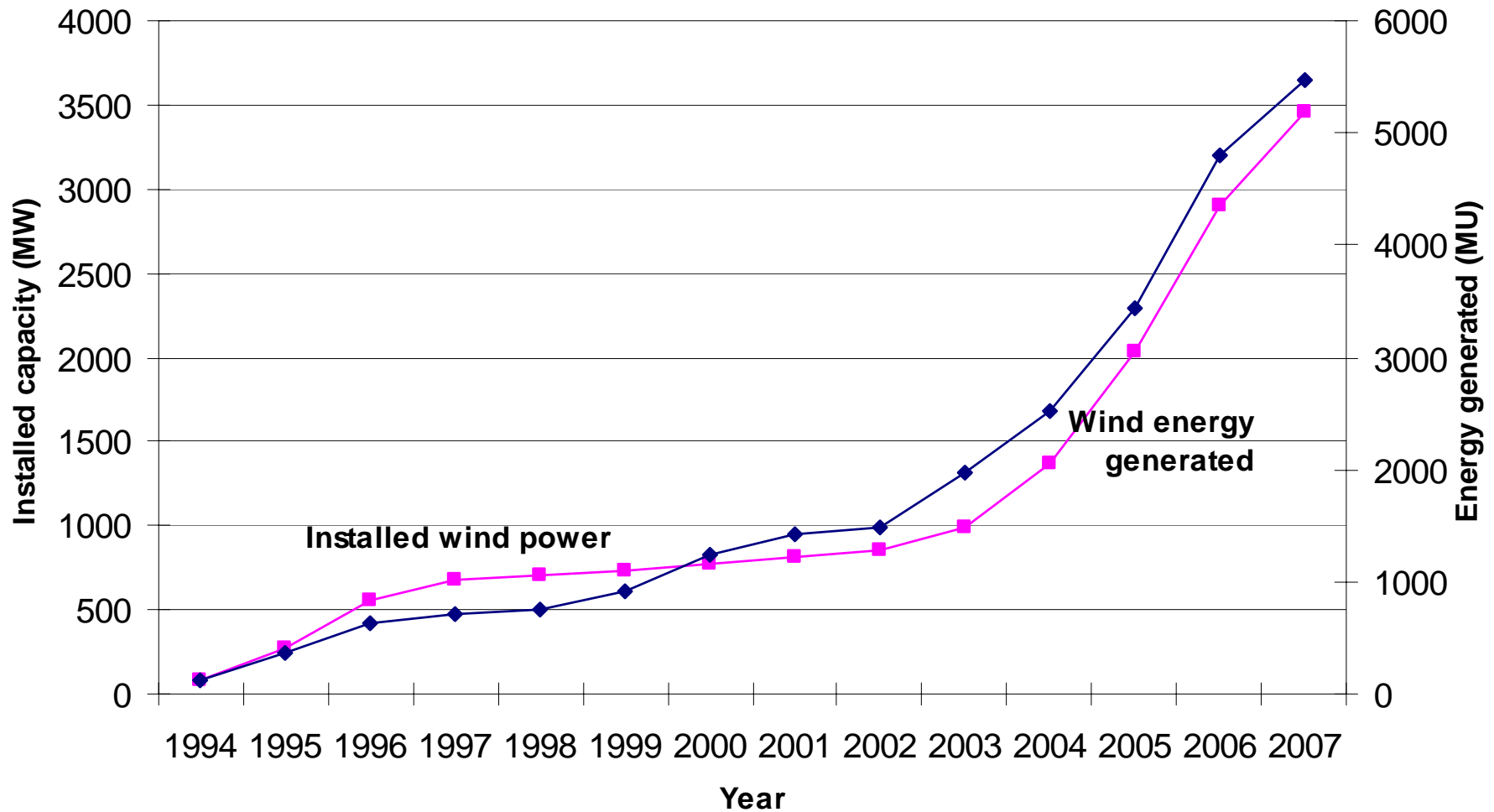
# Tamil Nadu location



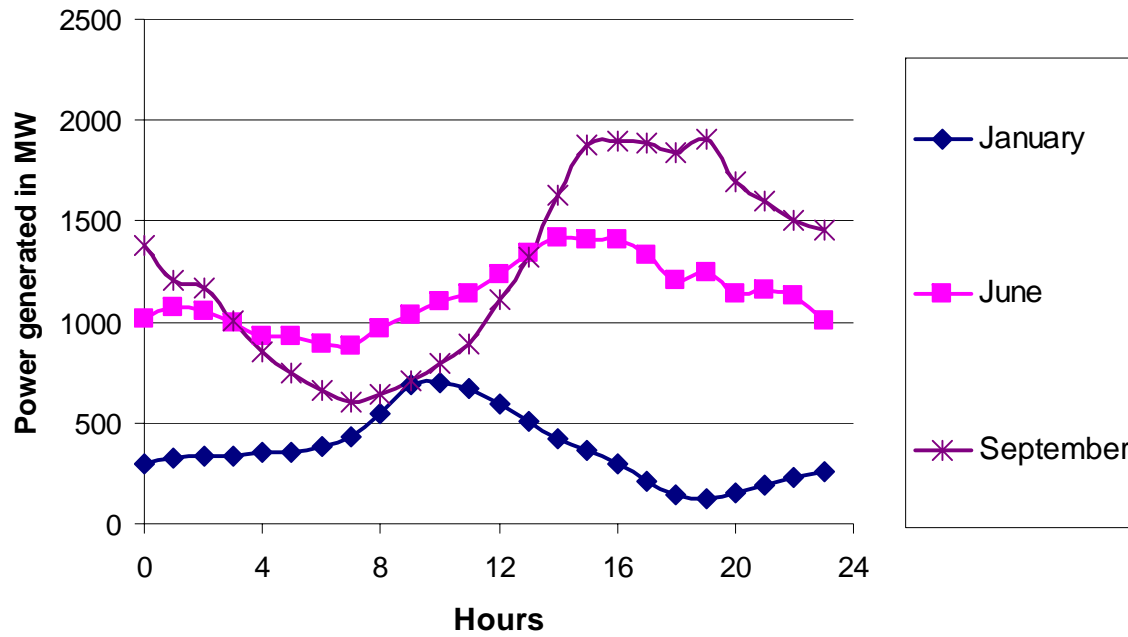
## Tamil Nadu – Grid Details

Source	Installed capacity (MW)	Annual Energy generated (MU)	Annual average capacity factor (%)
Coal	2970	21230	81.6
Gas	424	1945	52.4
Hydro	2187	6290	32.8
Firm central share <sup>#</sup>	2825	17785	71.9
<b>Wind (state + private)</b>	<b>3856</b>	<b>5270</b>	<b>18.6</b>
Other renewables (solar PV, biomass and Bagasse based cogeneration)	556	1220	25.1
Independent power projects (coal, lignite, diesel or gas based)	1180	6360	61.5
Assistance from other regional grids	519	2280	50.1
<b>Total</b>	<b>14517</b>	<b>63370</b>	<b>49.8</b>

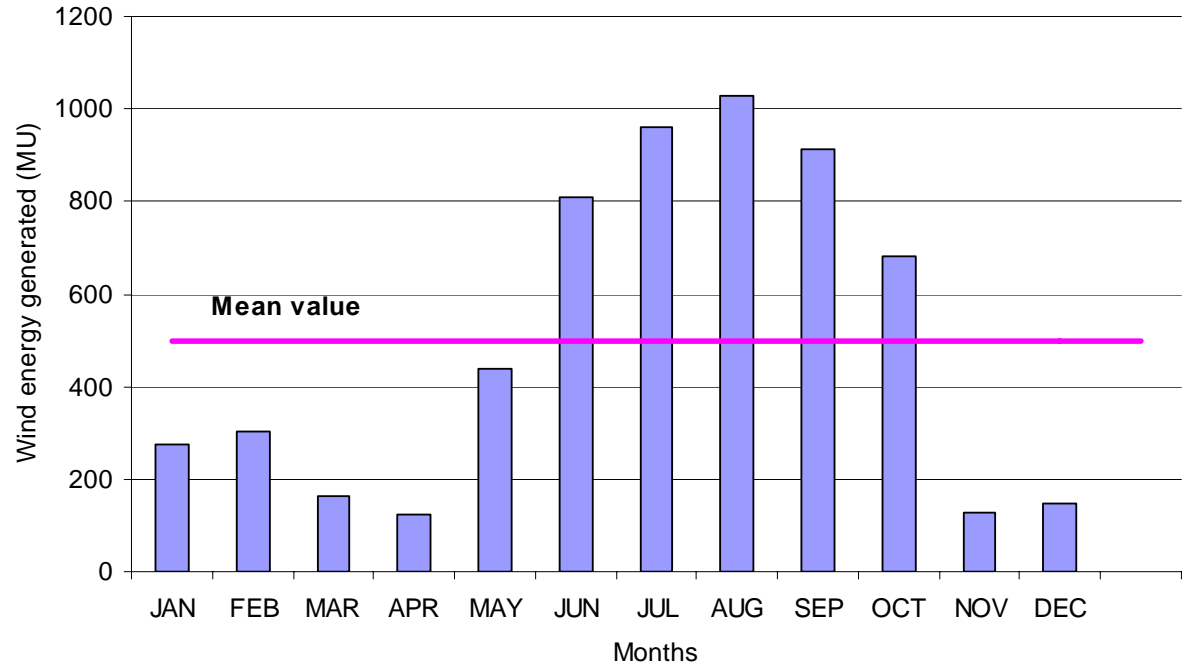
# TN – Installed wind power and wind energy generated



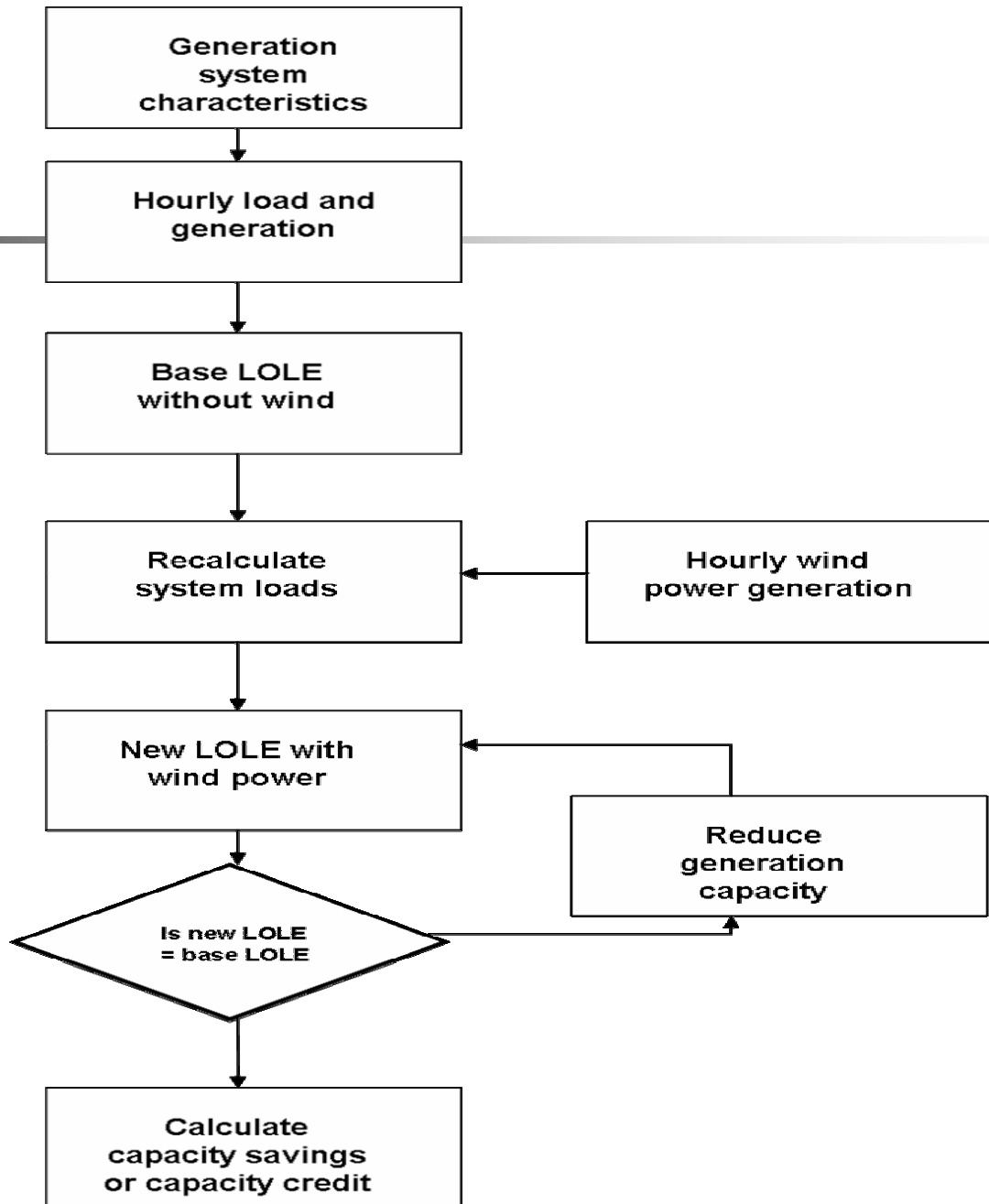
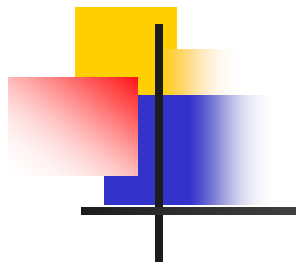
## Hourly variation of wind power



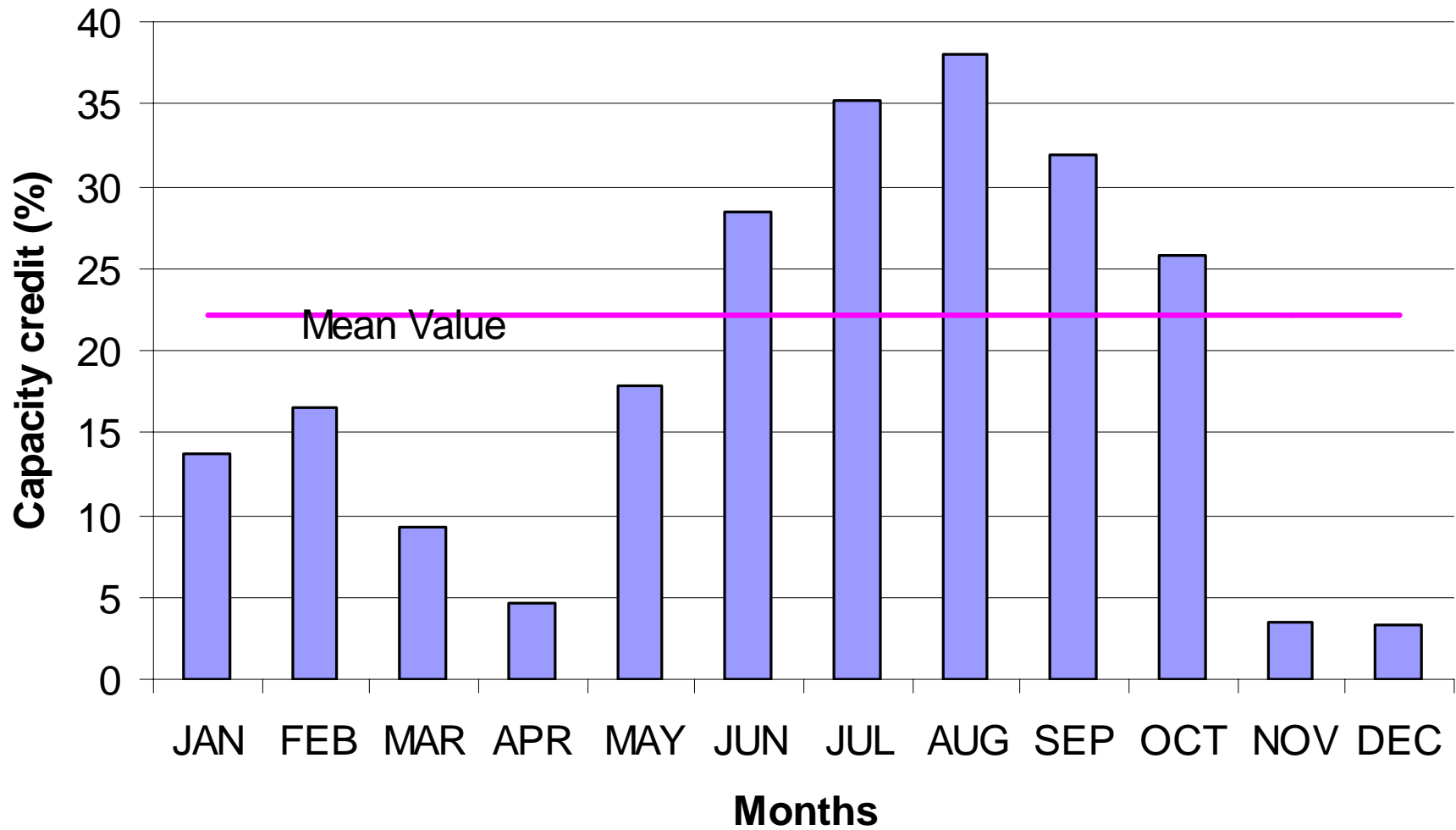
## Monthly variation of wind energy generated

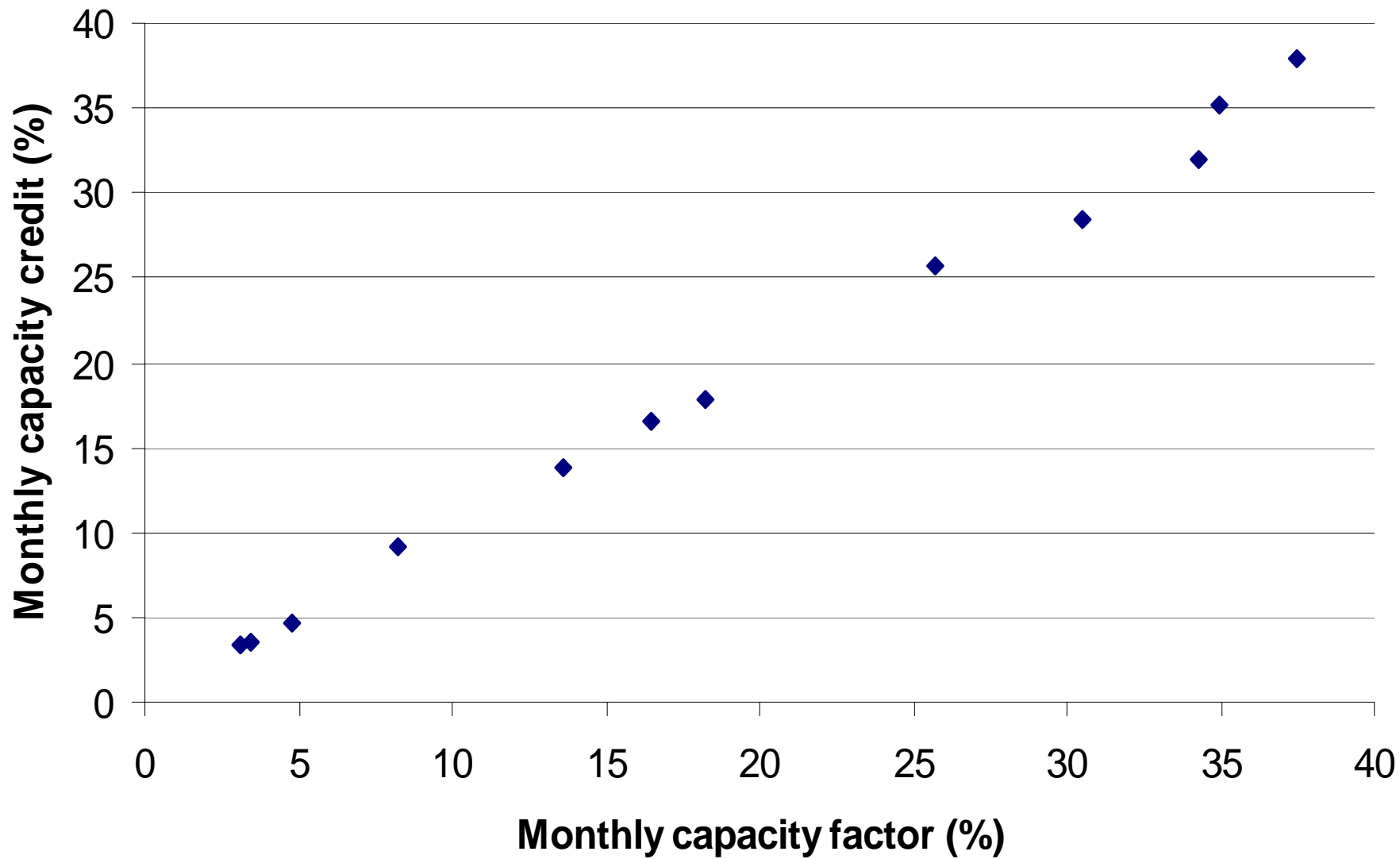


# Capacity Credit Methodology



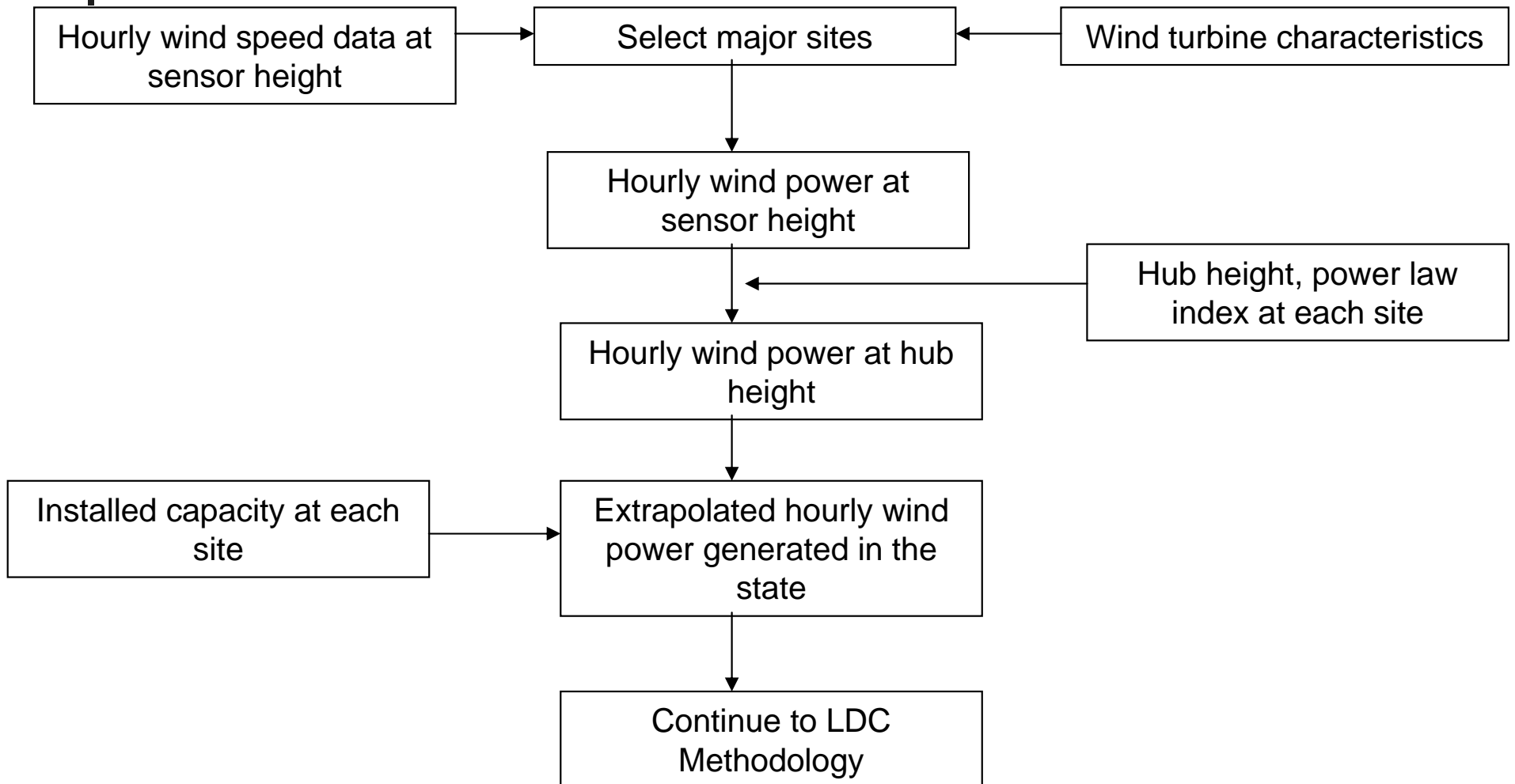
# Variation of CC

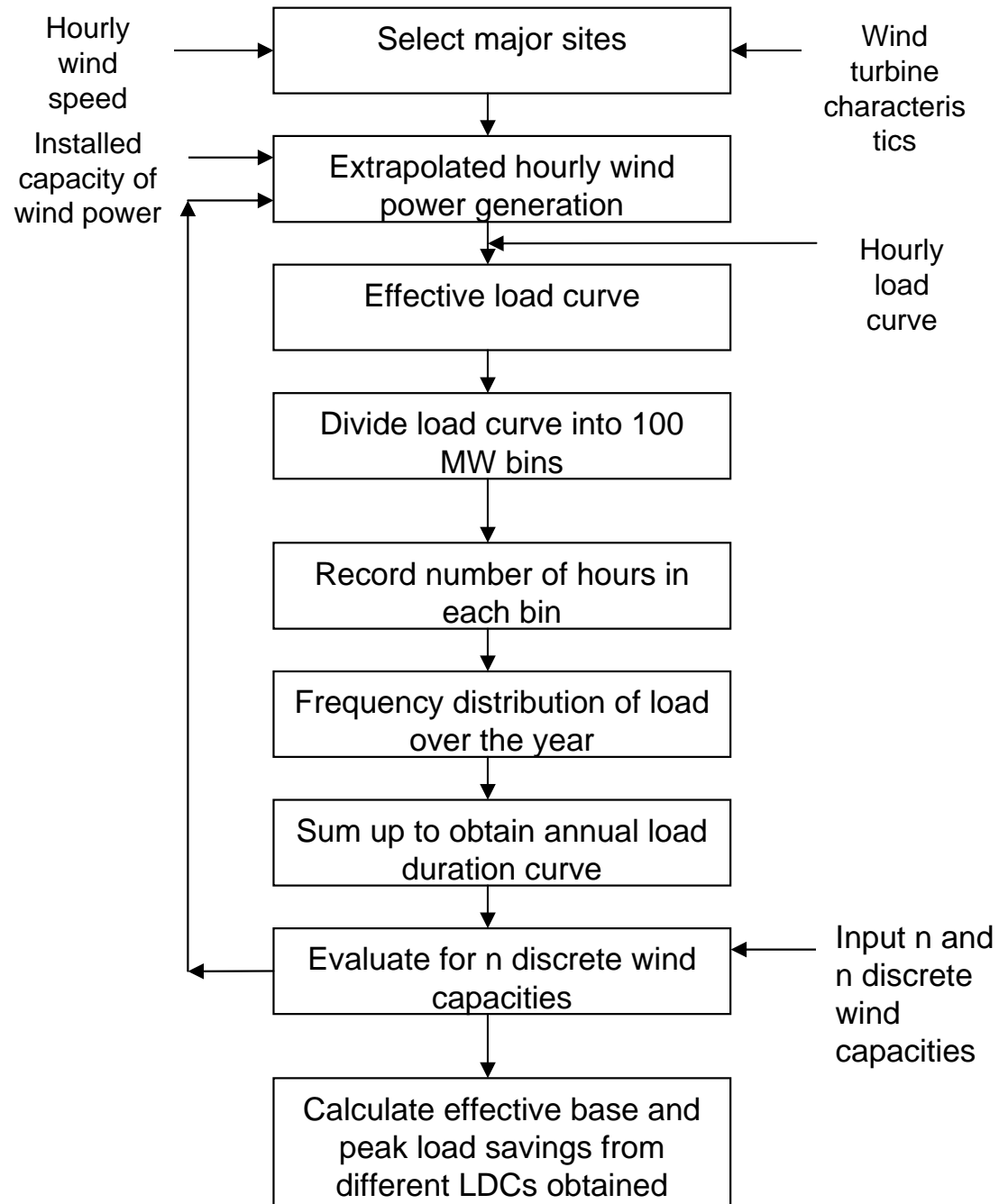




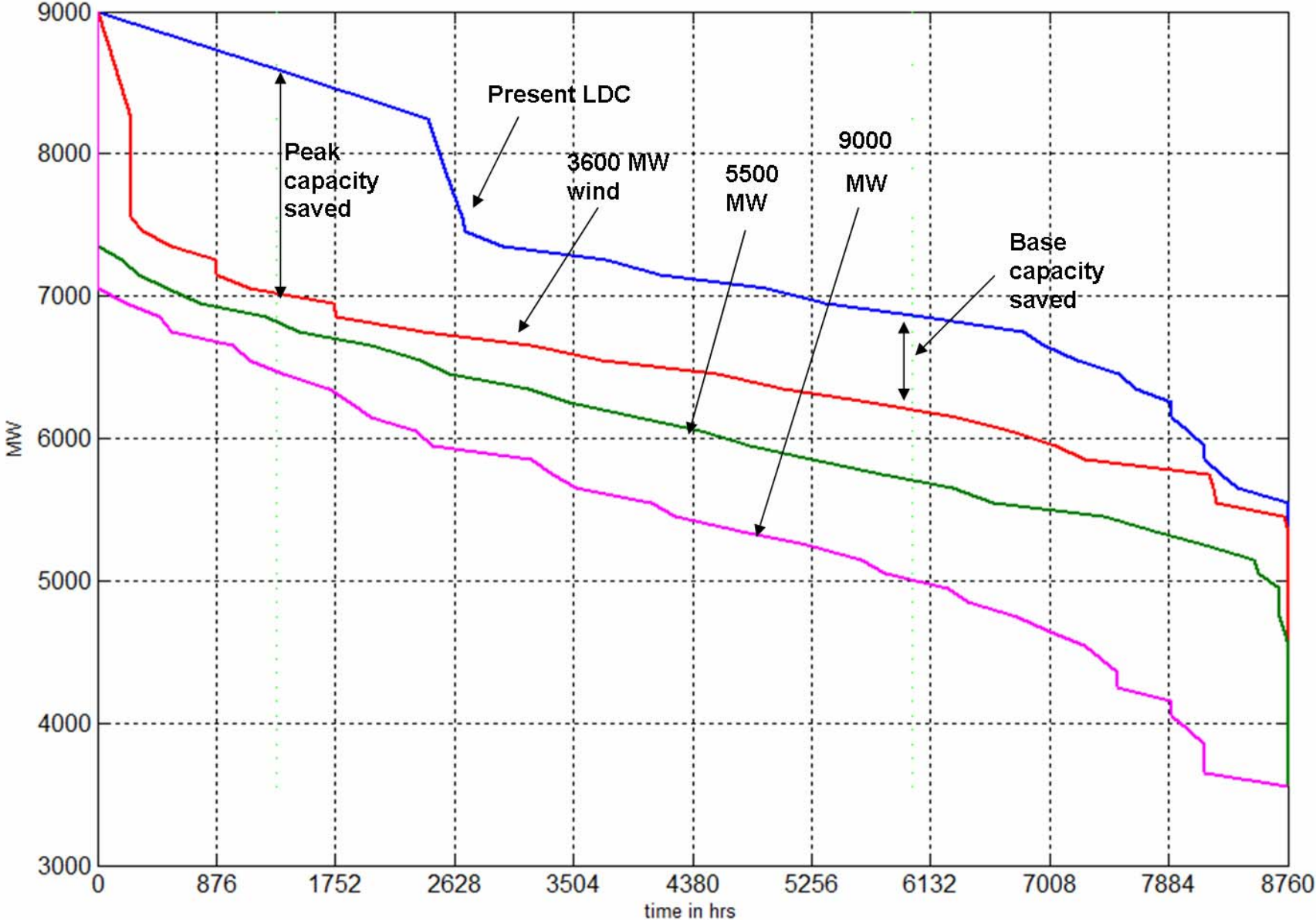
<b>Percentage penetration of wind power (%)</b>	<b>Wind power installed capacity (MW)</b>	<b>Capacity credit (MW)</b>
0	0	0
5.5	500	130
11.1	1000	240
16.7	1500	350
22.2	2000	460
33.3	3000	675
44.4	4000	895
61.1	5500	1220
77.8	7000	1550
88.9	8000	1750
100	9000	1965

# Methodology – Wind (Micro level)



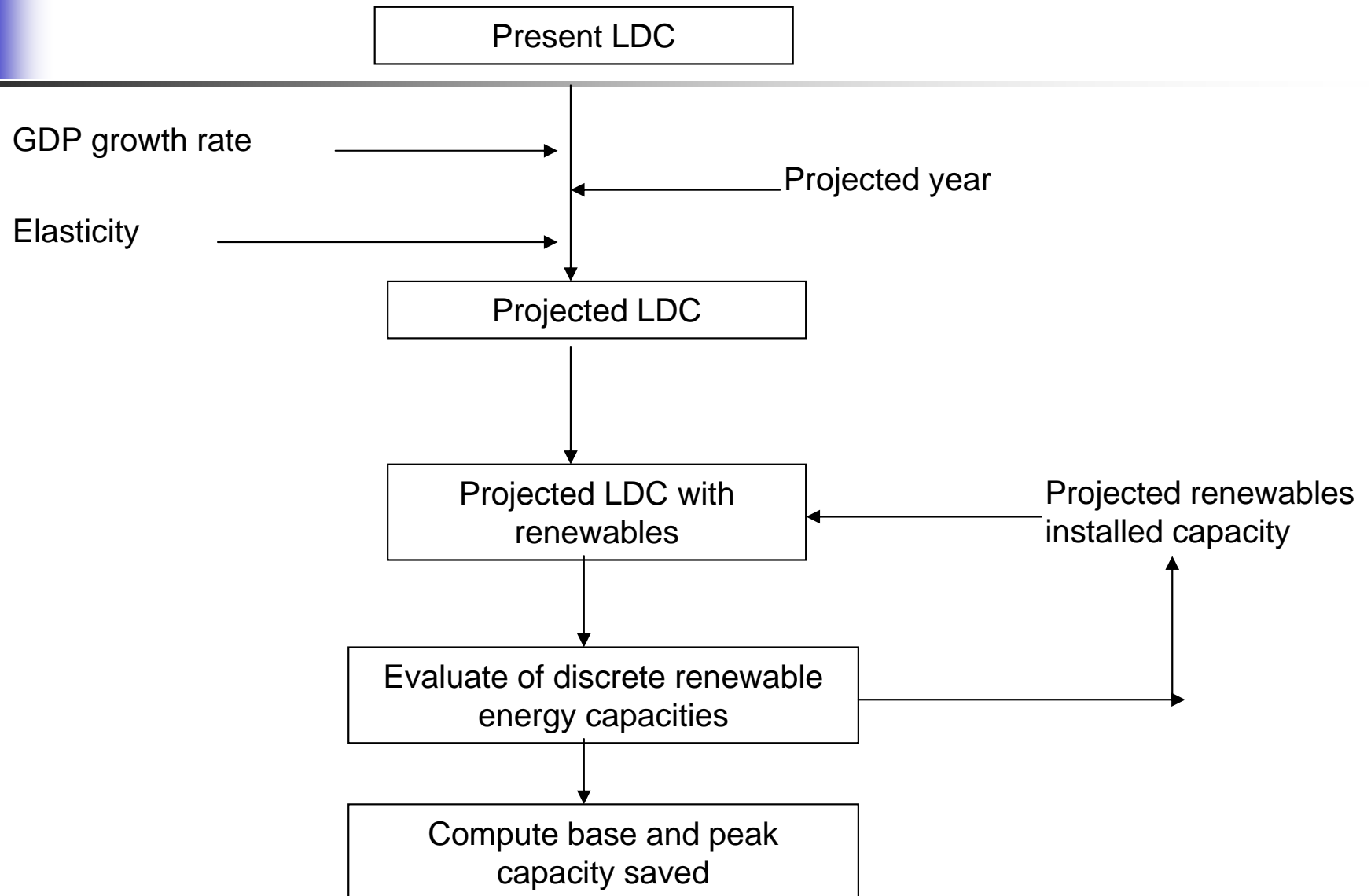


# Impacts on LDC

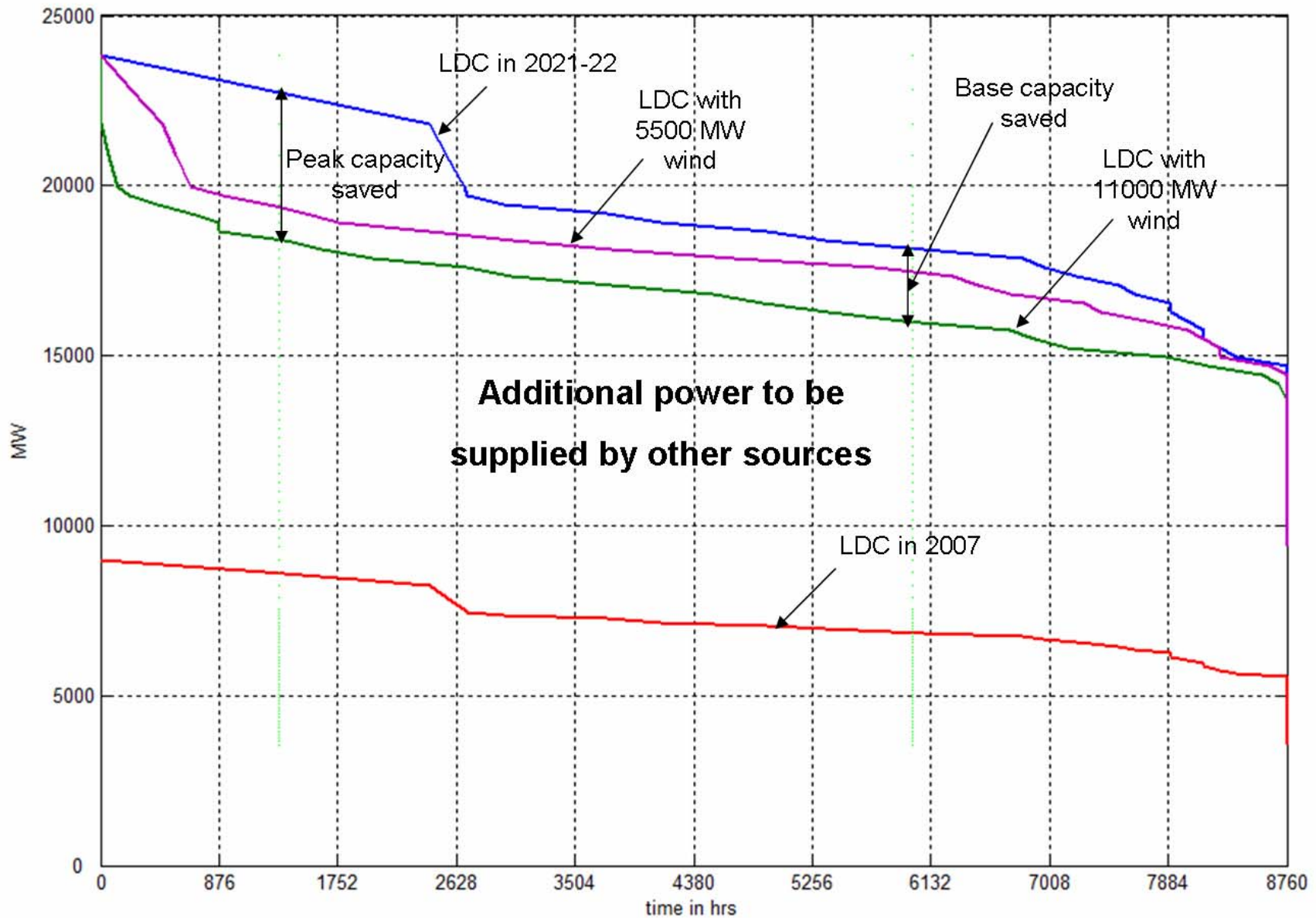


<b>Wind power installed capacity (MW)</b>	<b>Base load capacity saved (MW)</b>	<b>Peak load capacity saved (MW)</b>
0	0	0
500	60	70
1000	100	355
1500	150	1105
2000	240	1265
3000	470	1475
4000	770	1625
5500	1150	1775
7000	1460	1975
8000	1630	2085
9000	1855	2125

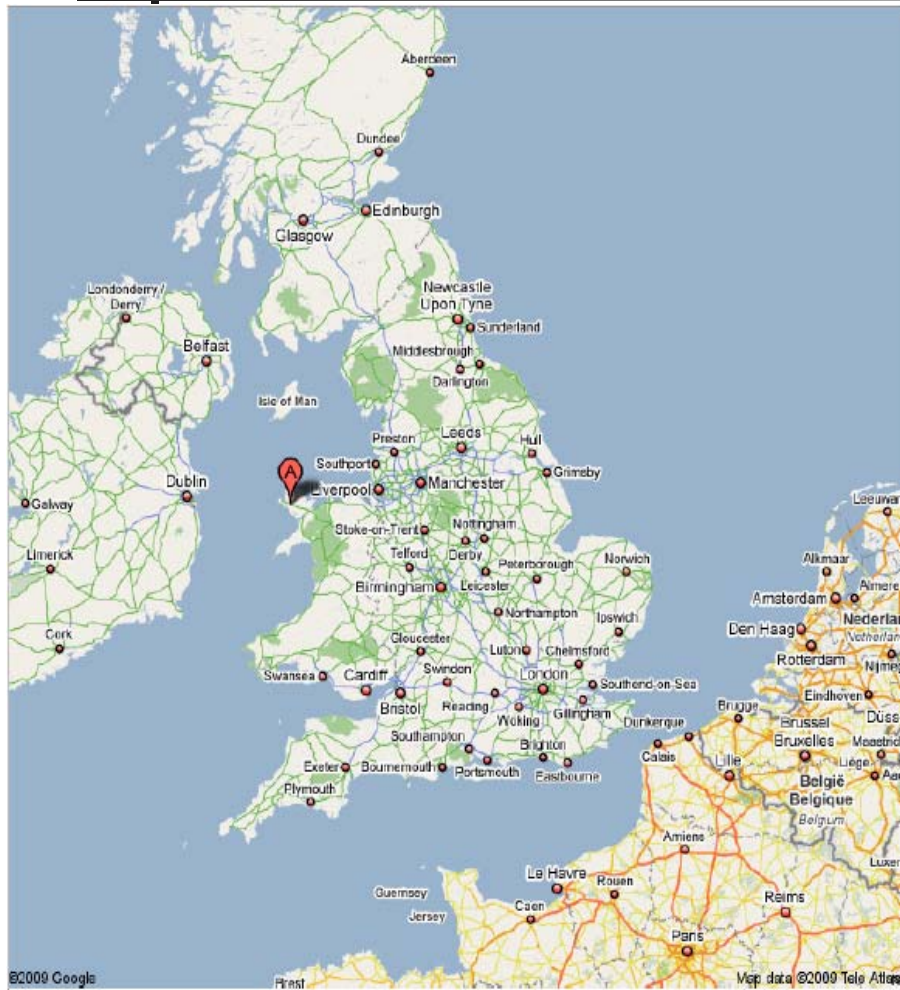
# LDC Methodology for future scenarios



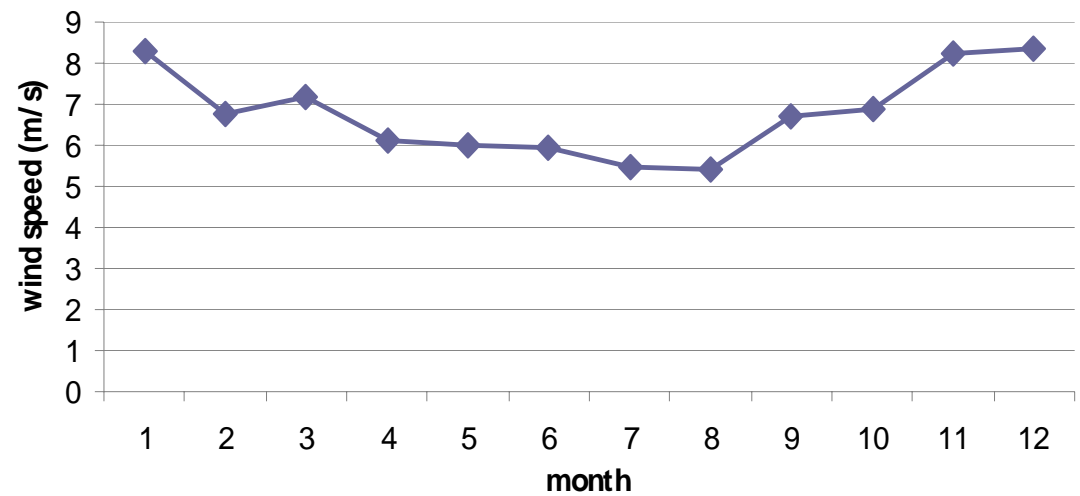
# TN – Wind energy scenarios for 2021



# Simulation for UK

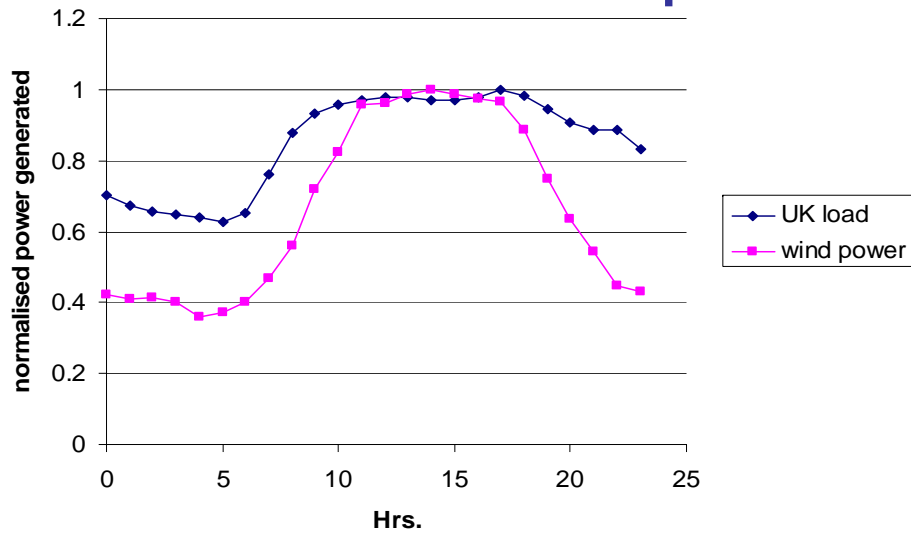


## Mean monthly wind speed

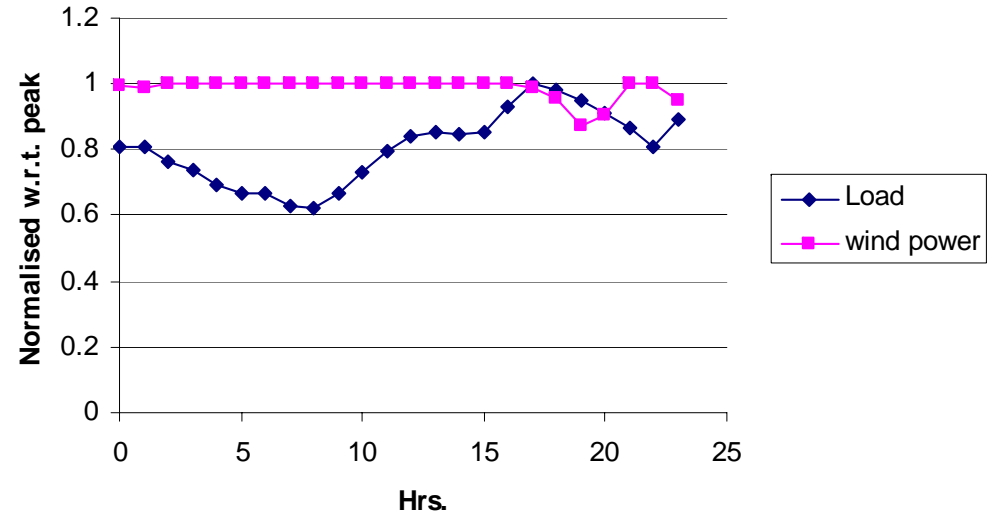


Site: Valley, Hollyhead, Anglesey (Wales)

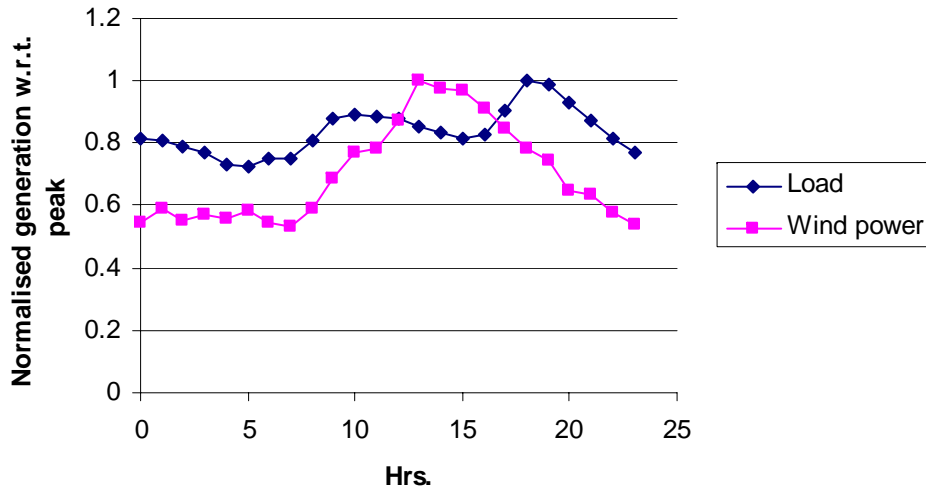
# Wind power - load curve correlation in UK



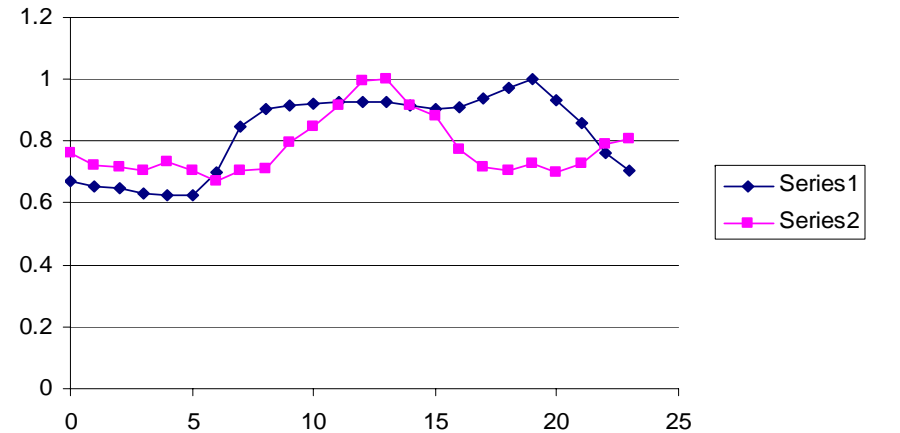
July – 0.88



Jan – (-)0.51



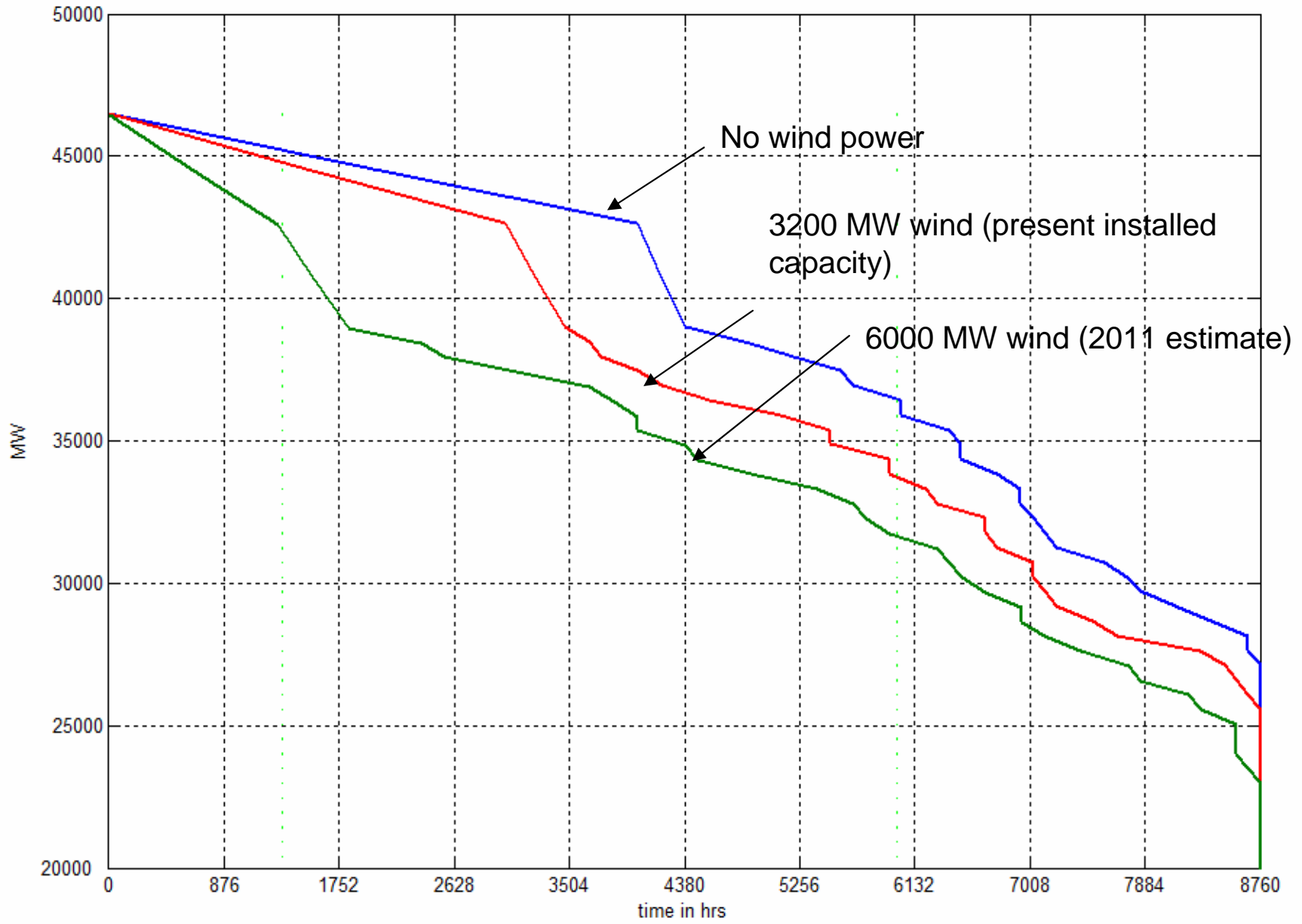
Mar – 0.48

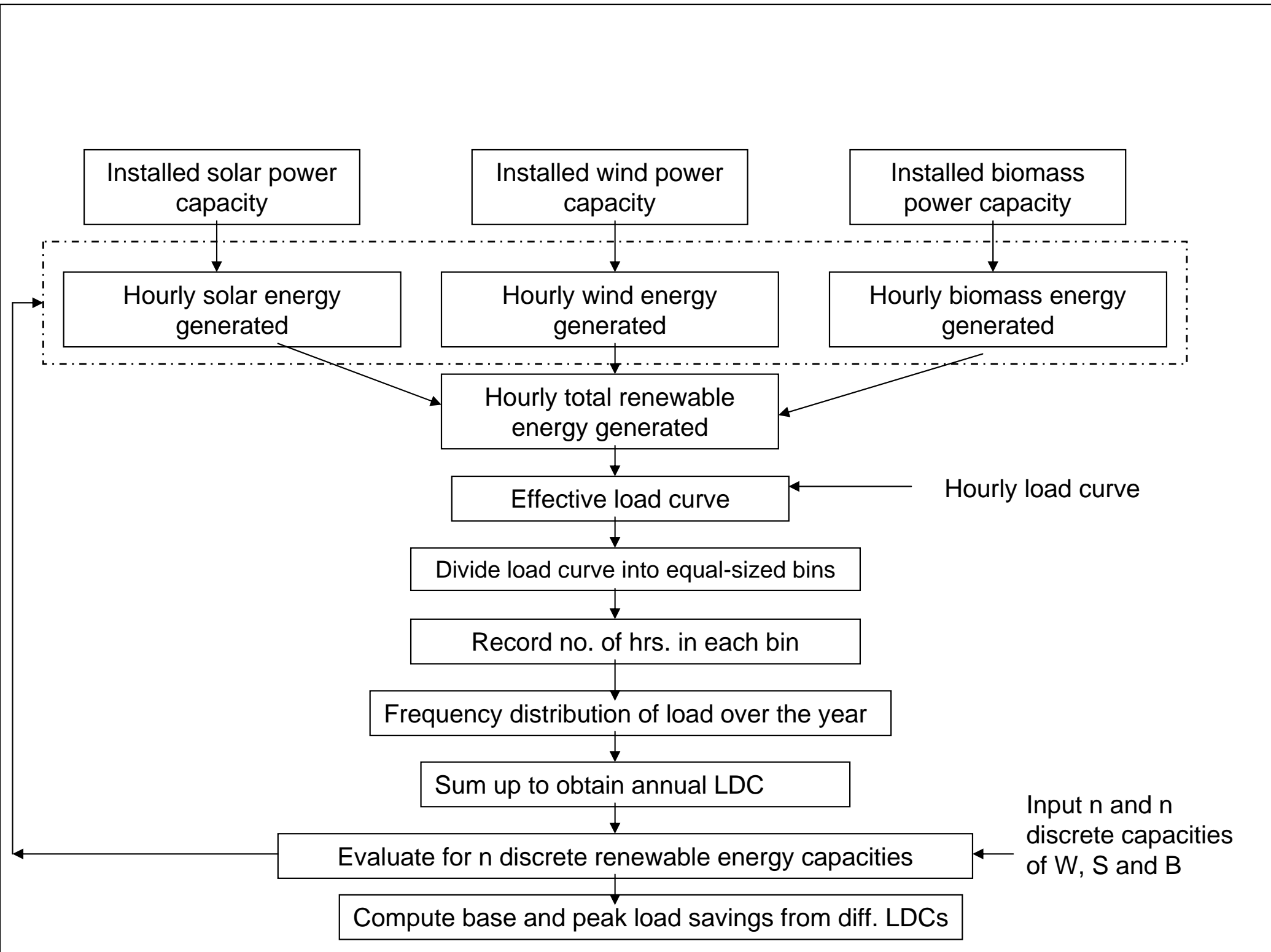


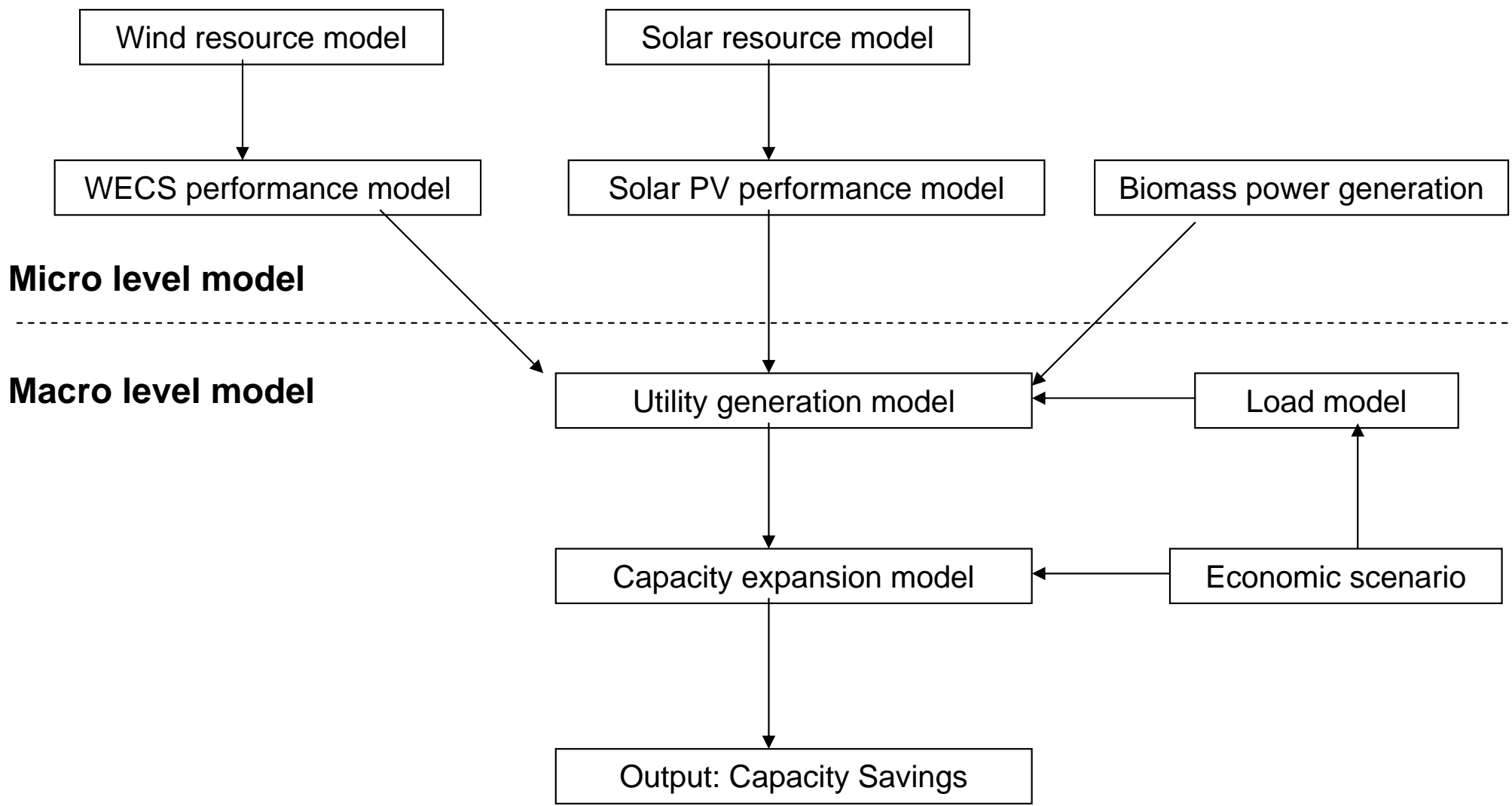
Oct – 0.39

Average correlation factor over the year = 0.38

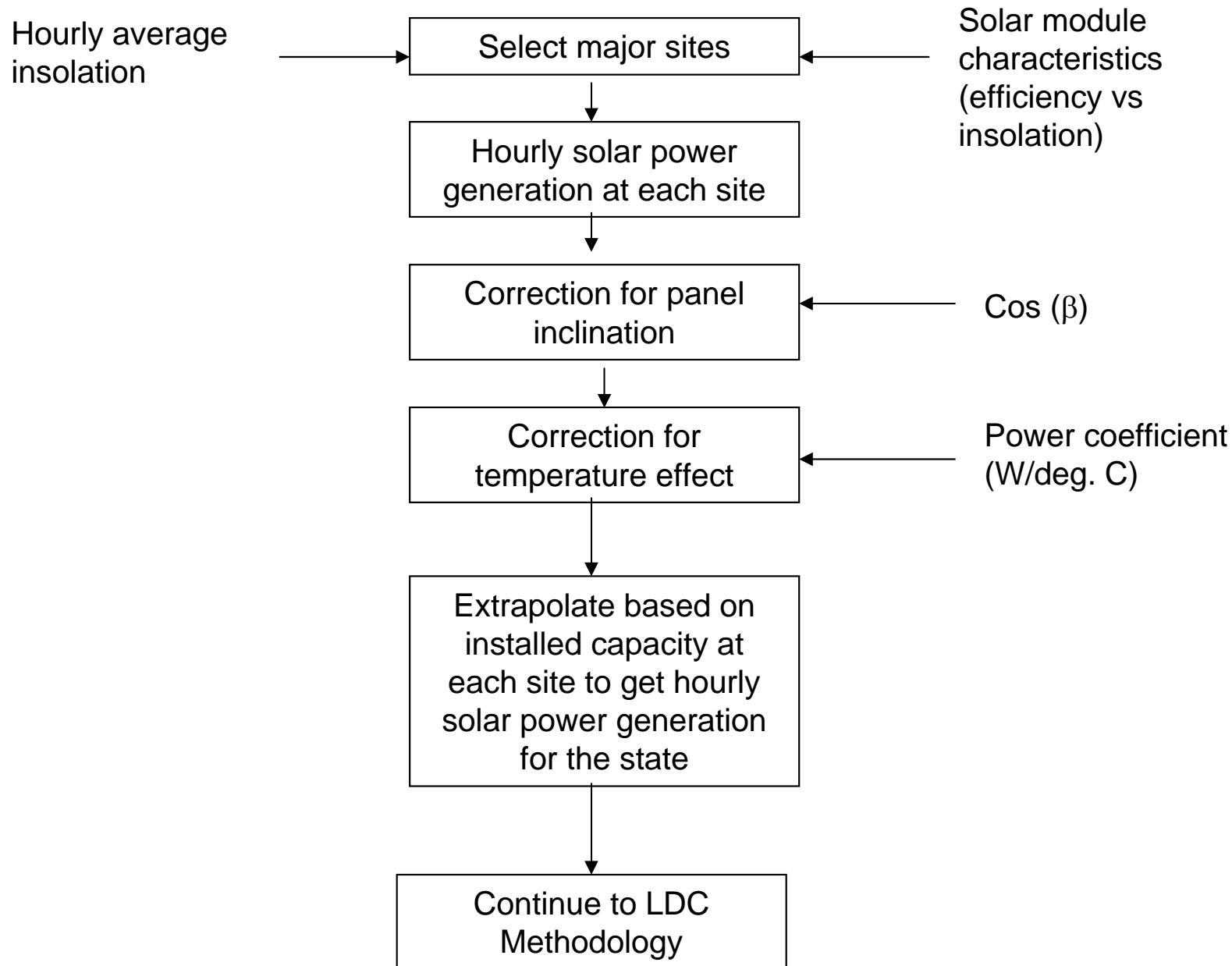
# Results for UK



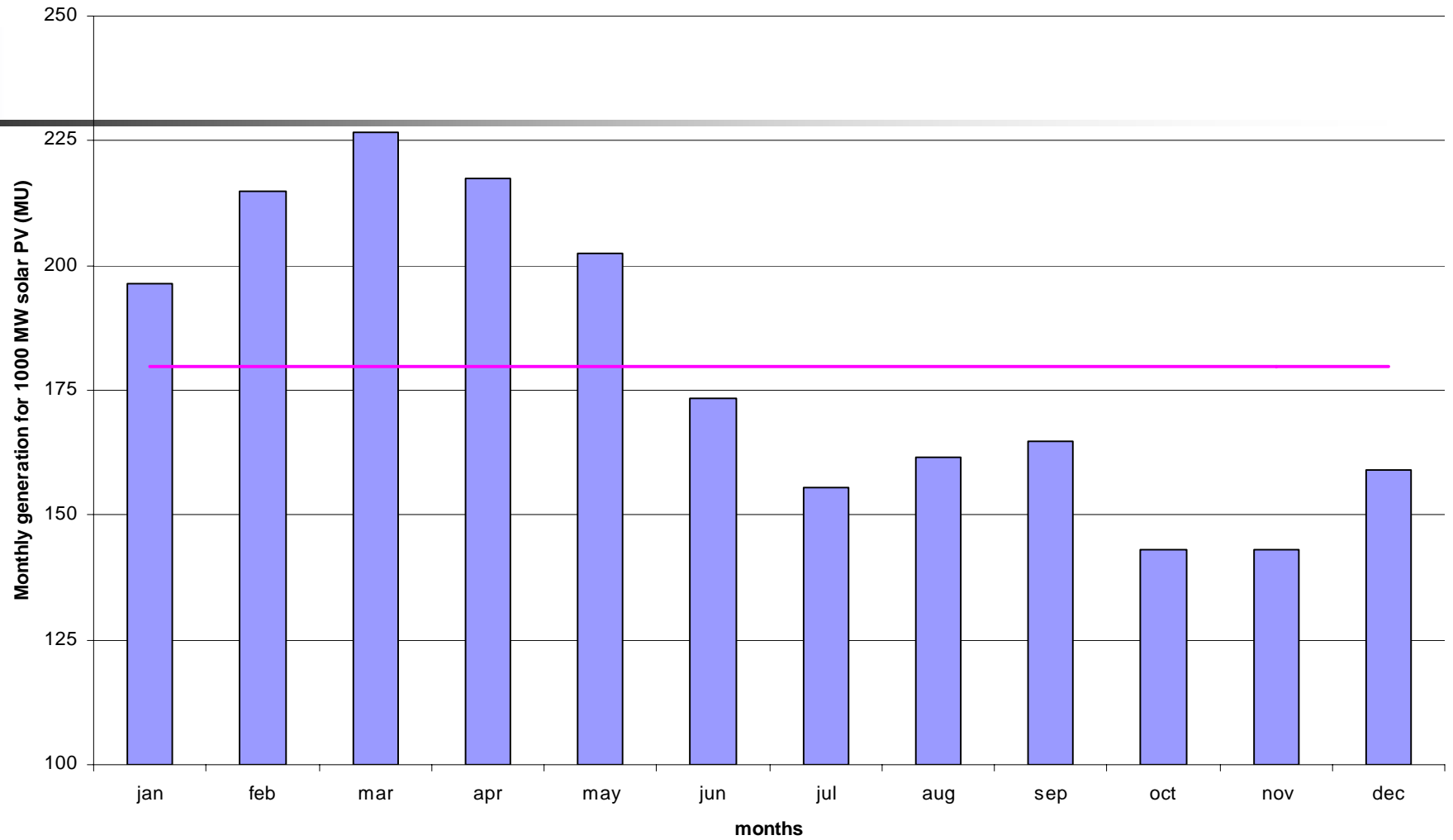




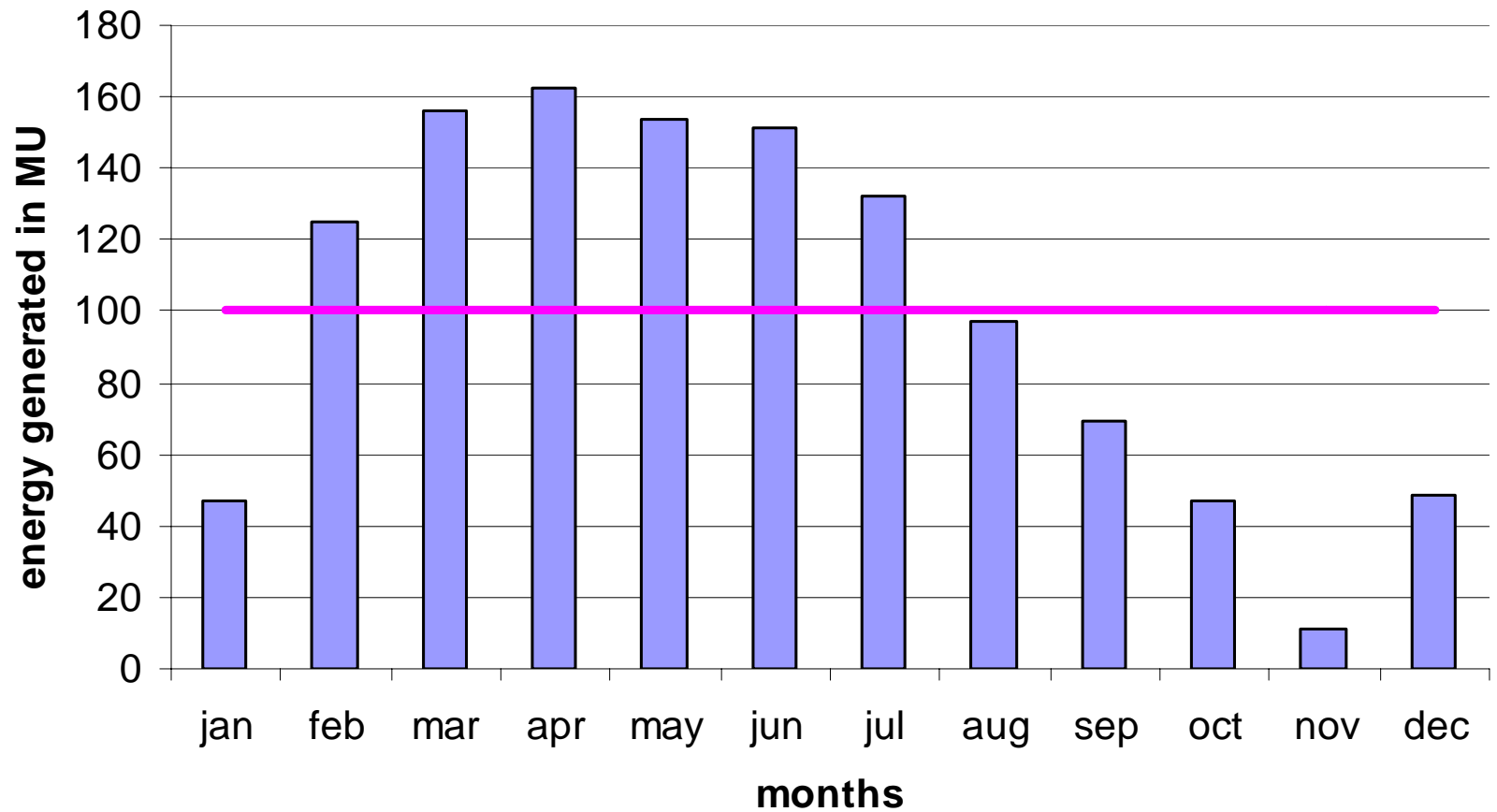
# TN Solar Methodology (Micro-level)



# Solar power – monthly variation

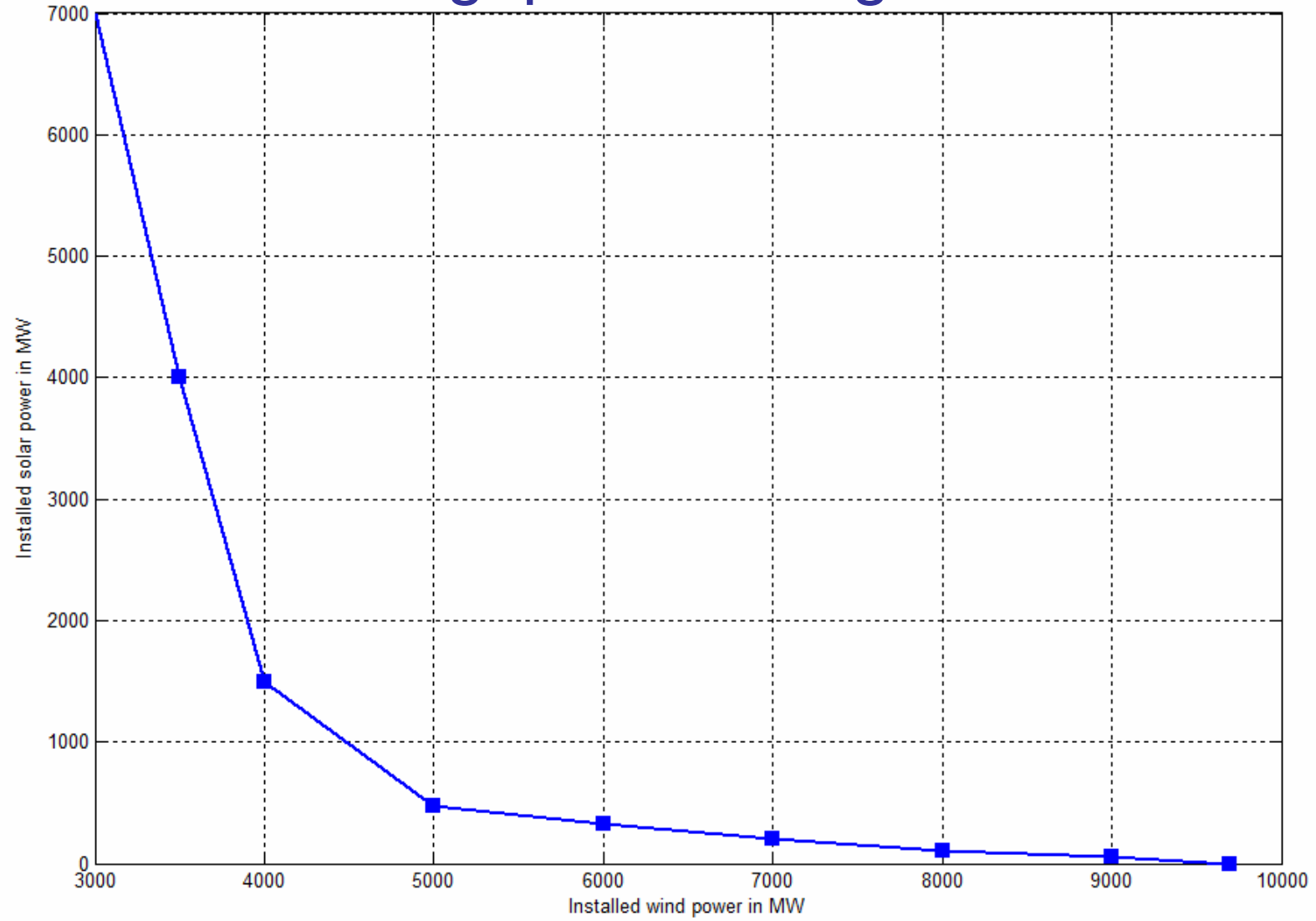


# Biomass power – monthly variation

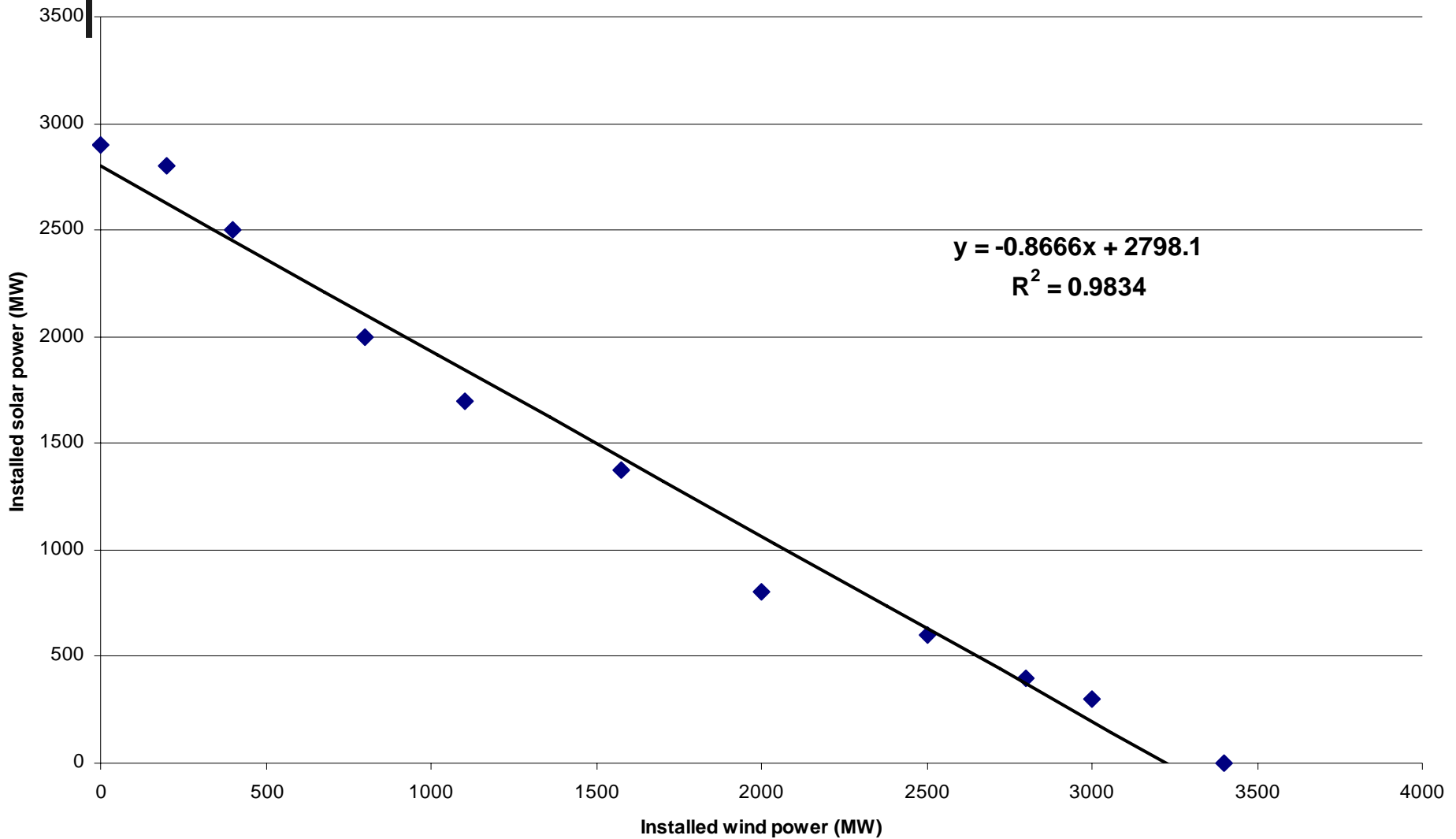


Installed capacity – 450 MW (340 MW from bagasse cogen)

# Wind and solar power required for 1000 MW avg. peak saving

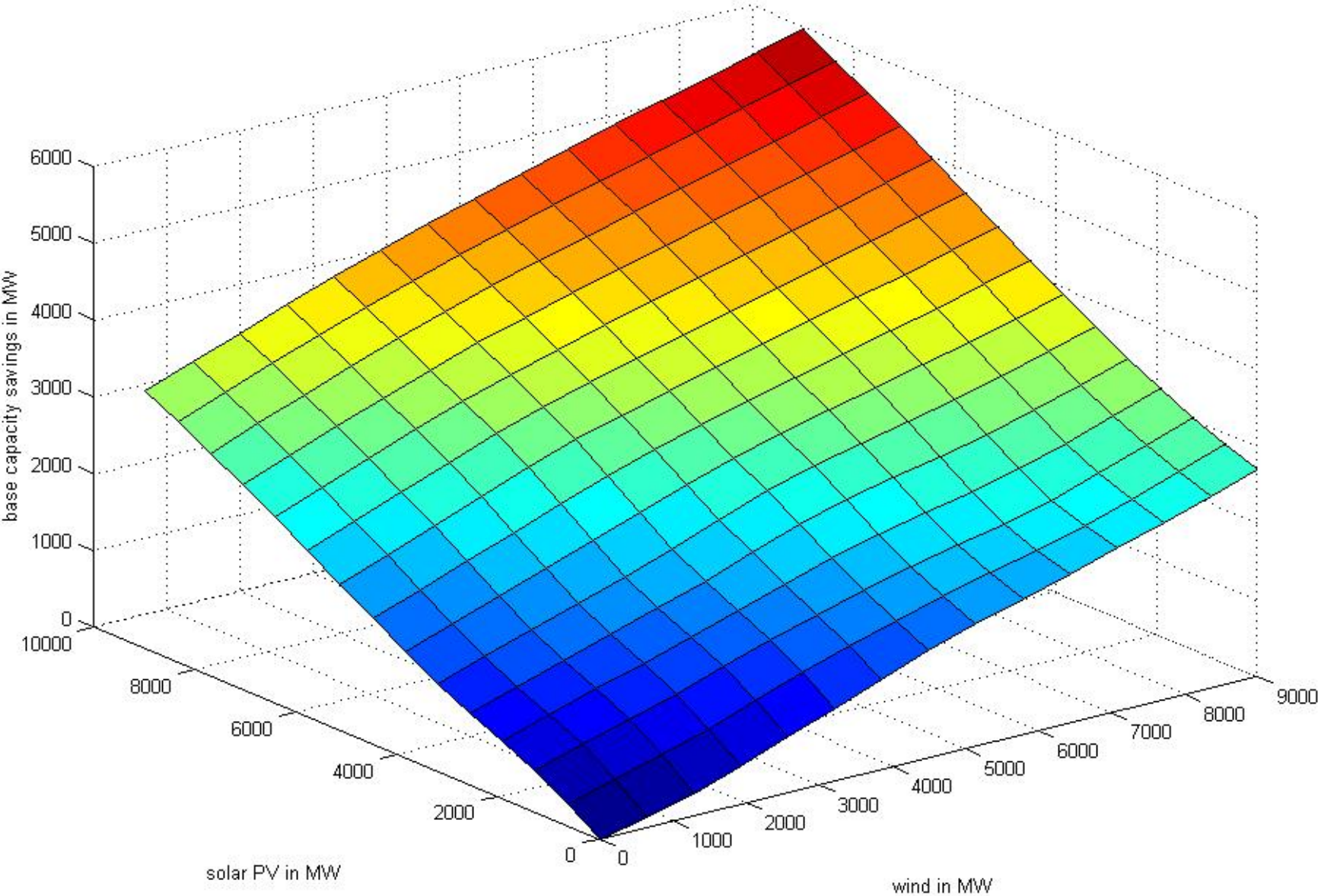


# Wind and solar power installations to replace 1000 MW base power

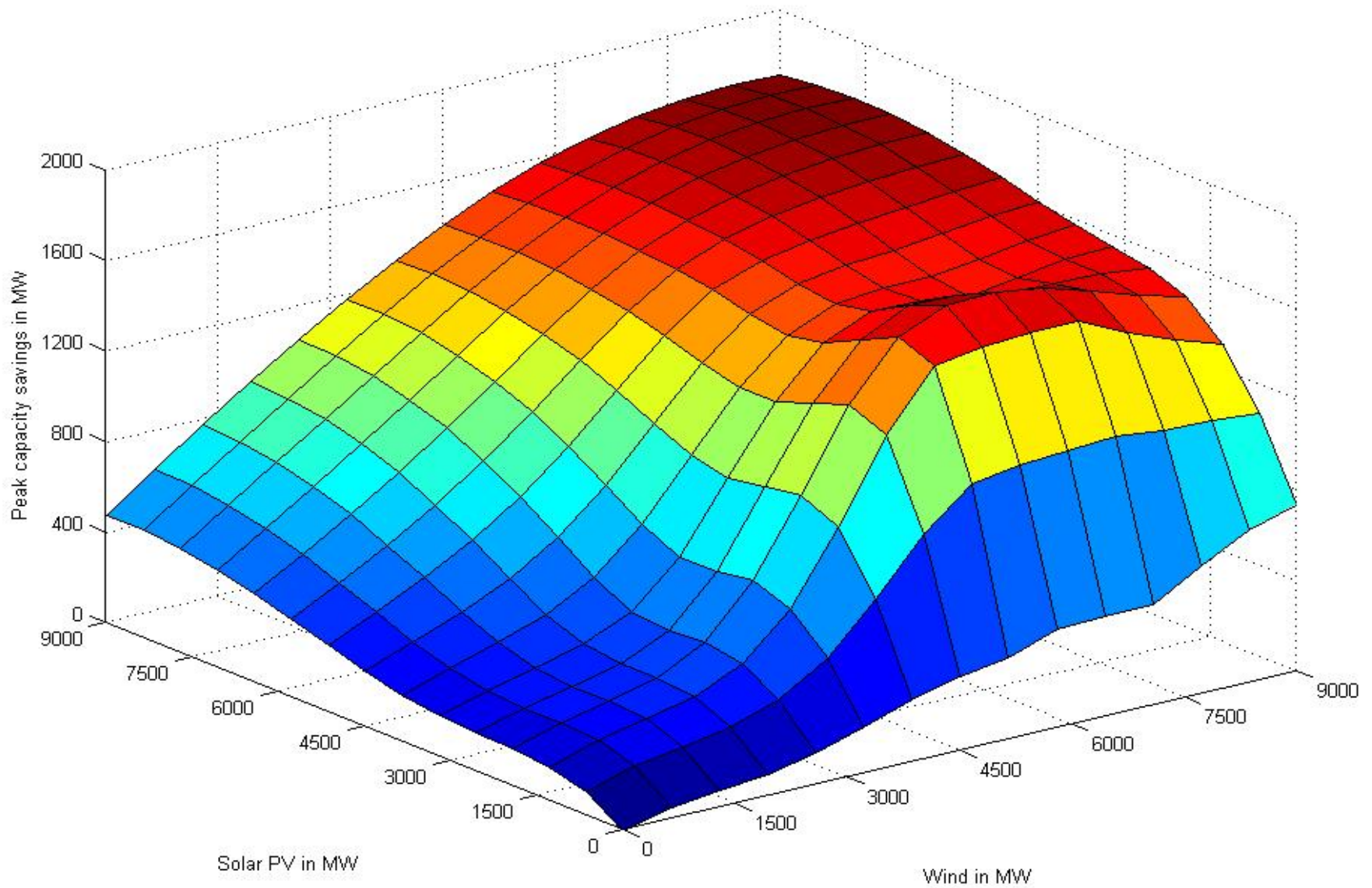


Slope = 0.8666 which is almost equal to ratio of capacity factors ( $0.18/0.21 = 0.857$ )

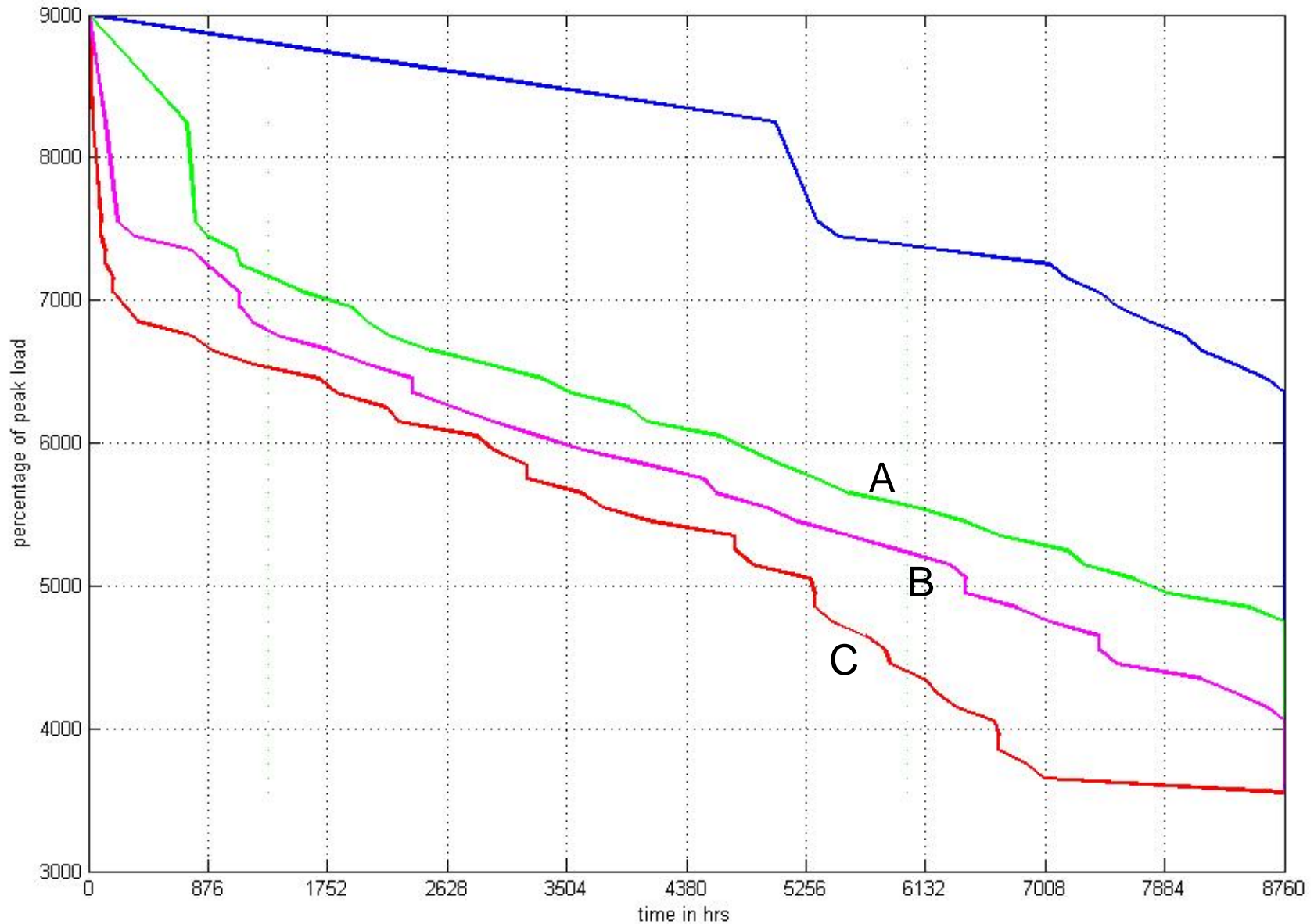
# Base capacity savings with wind + solar



# Peak capacity savings with wind + solar



# Hybrid scenarios – Impacts on LDC

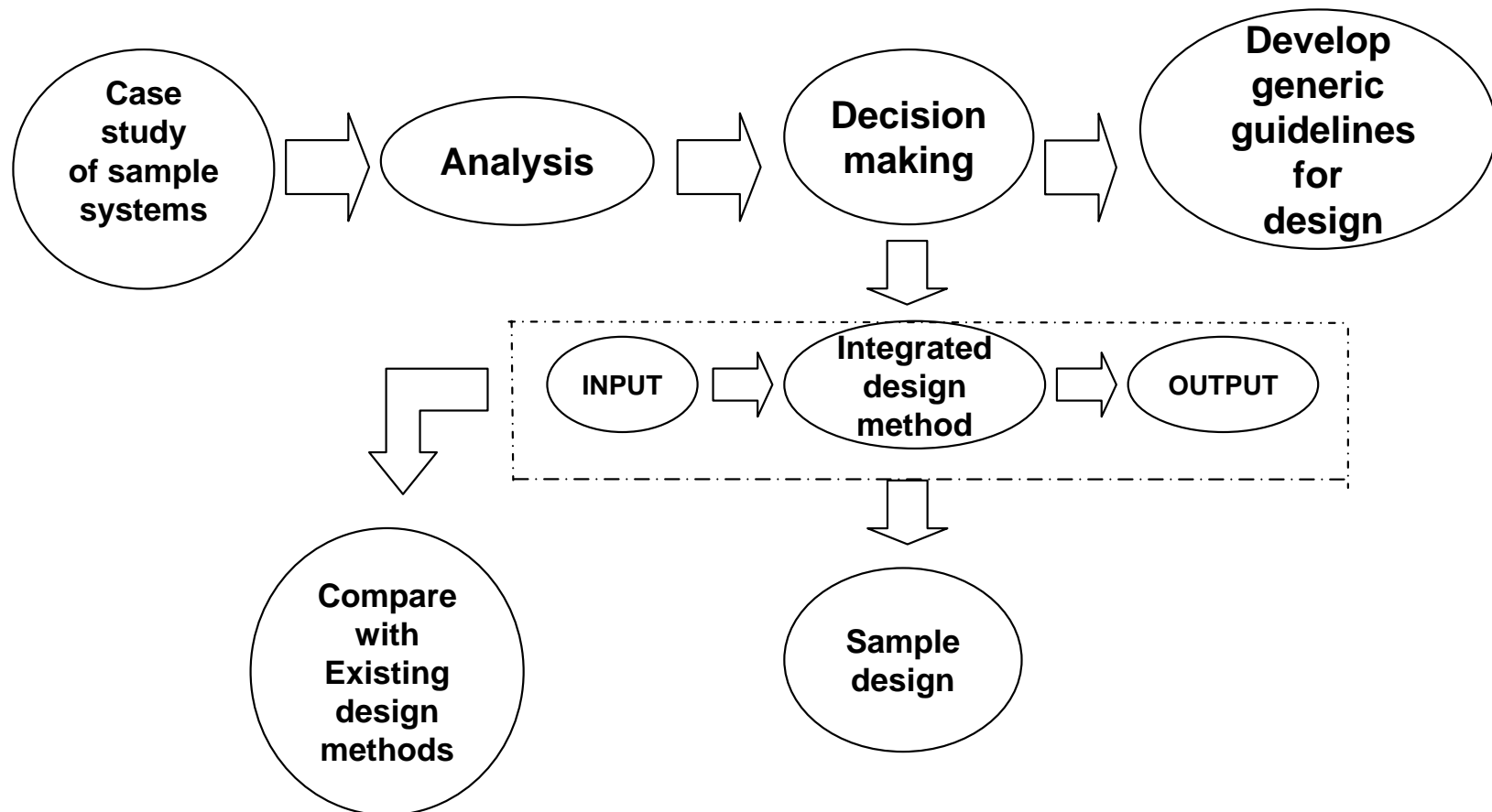




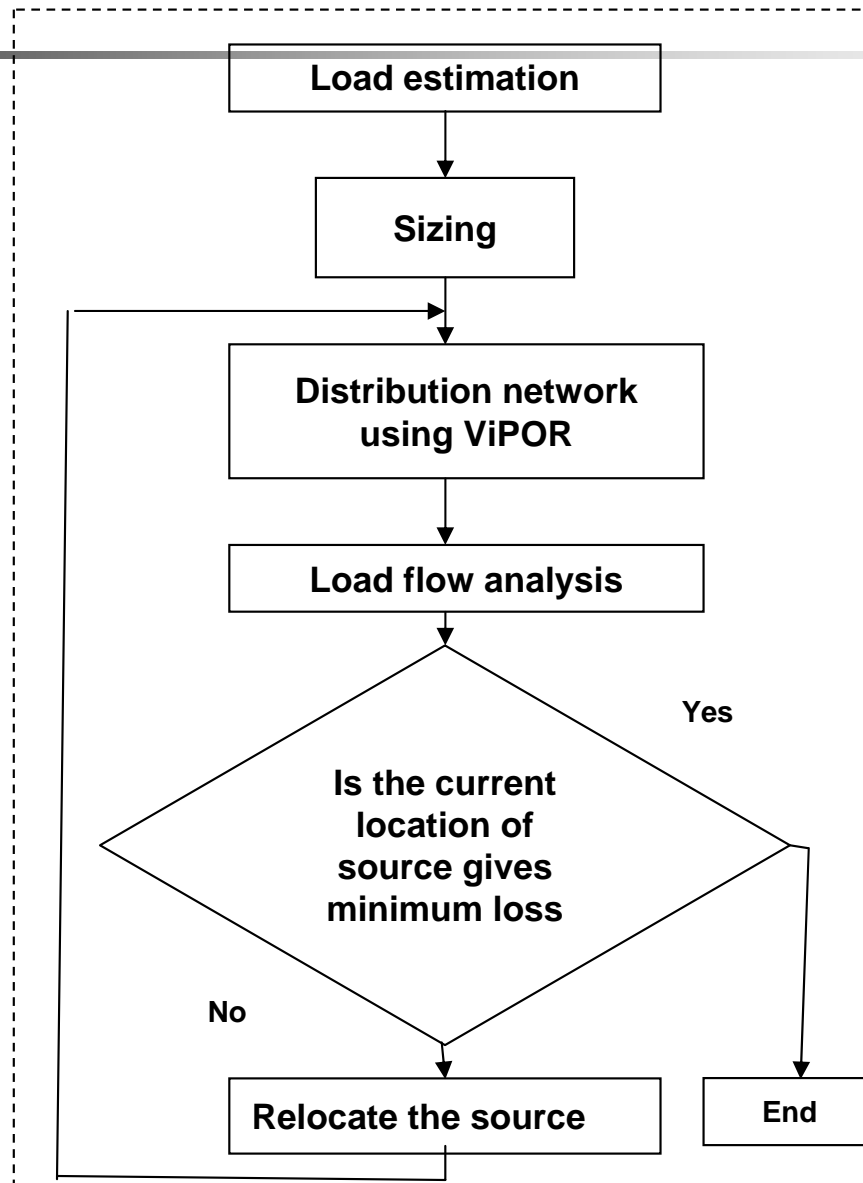
## Impacts on LDC – capacity savings

Scenario	Wind (MW)	Solar (MW)	Biomass (MW)	Base capacity saved (MW)	Base capacity saved (% of installed RE capacity)	Peak capacity saved (MW)	Peak capacity saved(% of installed RE capacity)
A	4000	1000	1000	1568	30.31	1252	27.22
B	5000	1000	1500	2137	28.66	1423	26.79
C	3000	3000	3000	2984	33.15	2276	25.29

# Design approach



# Integrated design of Isolated power system





# Integrated design-Summary

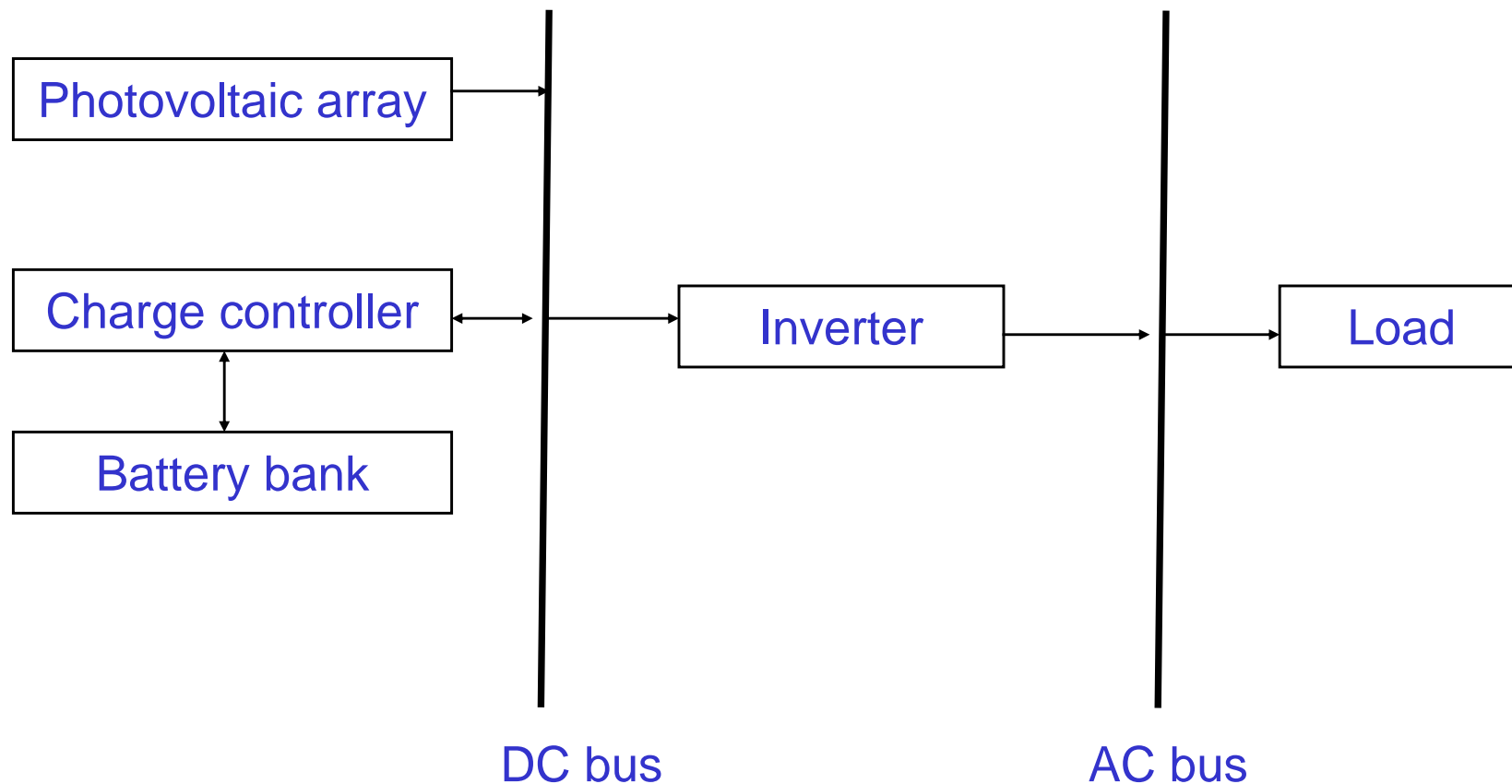
Name of the plant	Connected Load (kW)	Plant Capacity		Distribution loss (%)		Plant capacity factor (%)		Energy cost Rs / kWh	
		Existing	Designed	Existing	Designed	Existing	Designed	Existing	Designed
<b>Solar PV, Rajmachi</b>	<b>1.4</b>	<b>5 kWp</b>	<b>4 kWp</b>	<b>4.6</b>	<b>0.5</b>	<b>8.3</b>	<b>11.5</b>	<b>32</b>	<b>25</b>
<b>Biomass gasifier, Dissoli</b>	<b>6.9</b>	<b>10 kW</b>	<b>10 kW</b>	<b>12.3</b>	<b>2.0</b>	<b>8.8</b>	<b>12</b>	<b>29-37</b>	<b>21-25</b>
<b>Biomass gasifier, Lonarwadi</b>	<b>10.7</b>	<b>20 kW</b>	<b>10 kW</b>	<b>14.6</b>	<b>2.7</b>	<b>5.6</b>	<b>14</b>	<b>43-54</b>	<b>16-25</b>

# Sizing of Photovoltaic-Battery Systems

## Objective:

- To arrive at the set of all feasible configurations (Array rating and Battery capacity) to meet a given demand following a time-series simulation of the system

## Schematic of the System



# Mathematical model

## ➤ Energy balance

$$\frac{dQ_B}{dt} = (P_P(t) - D(t))f(t)$$

Power from the photovoltaic array

## ➤ For a small time step, battery energy:

$$Q_B(t + \Delta t) = Q_B(t) + (P_P(t) - D(t))f(t)\Delta t$$

Hourly energy balance

$$Q_B(t = 0) = Q_B(t = T)$$

Repeatability of battery energy

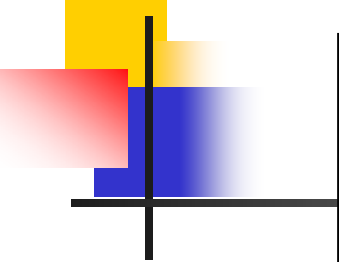
$$Q_B(t) \geq 0$$

Non negativity of battery energy

$$B_r = \frac{\max\{Q_B(t)\}}{DOD}$$

Battery storage requirement

# Photovoltaic-Battery System Sizing (Deterministic Approach)



Inputs: Hourly solar insolation data, Hourly load data,  
Photovoltaic system efficiency, Power conversion  
efficiency

↓

Estimation of the solar insolation incident on the array

↓

System simulation to obtain the minimum array size  
and the corresponding battery capacity

↓

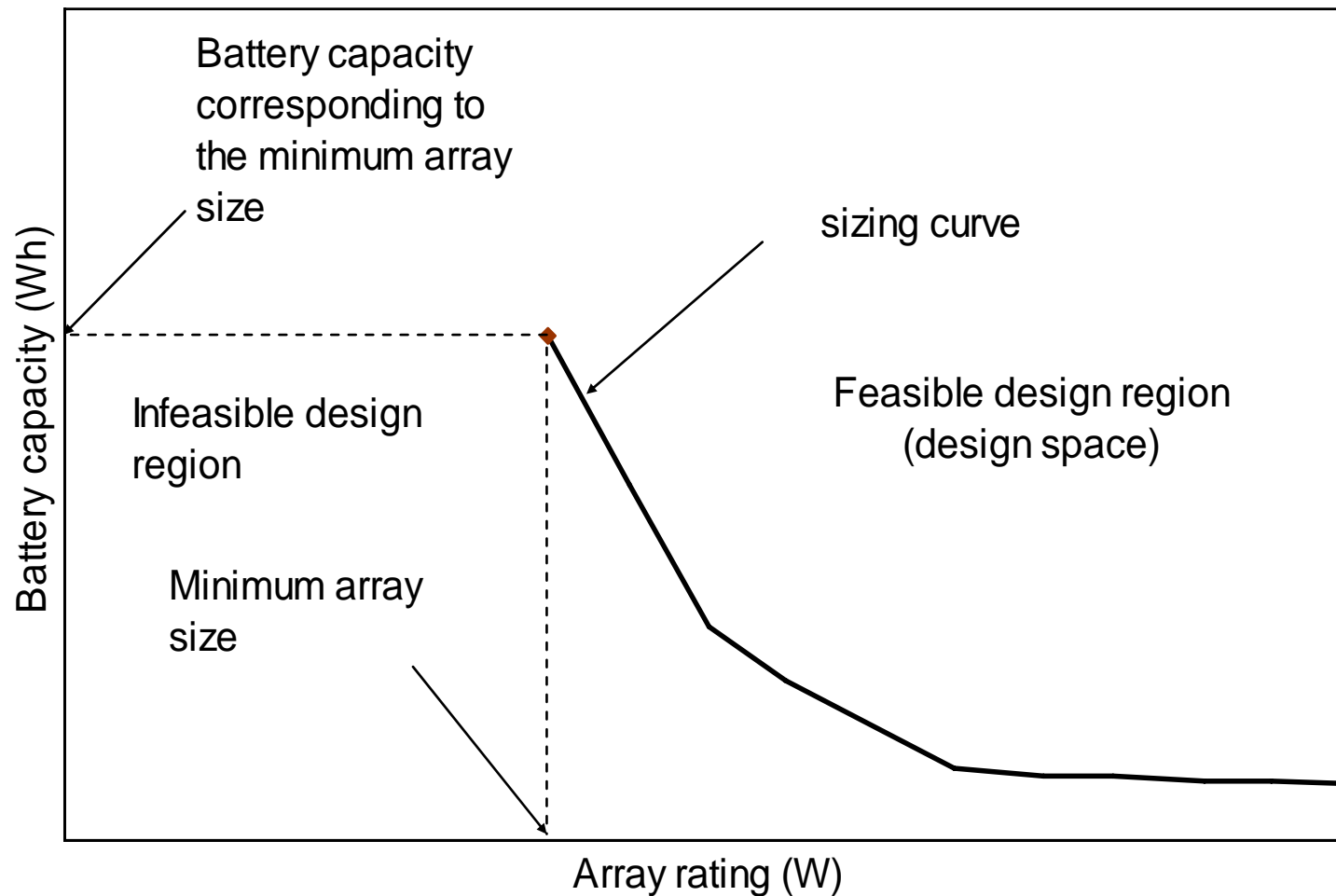
Calculation of the minimum storage capacity for  
different array sizes greater than the minimum

↓

Plot of sizing curve and the identification of the  
design space

# Graphical representation

- Sizing curve for given solar insolation profile, load curve and system characteristics

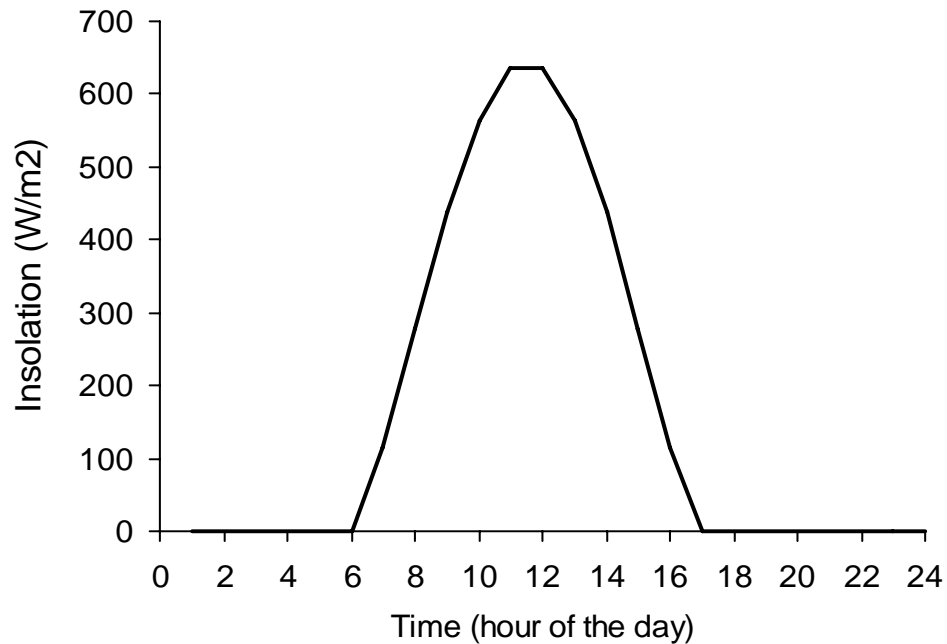


# Photovoltaic-Battery System Sizing (Example)

For a remote location in Sagar island, West Bengal

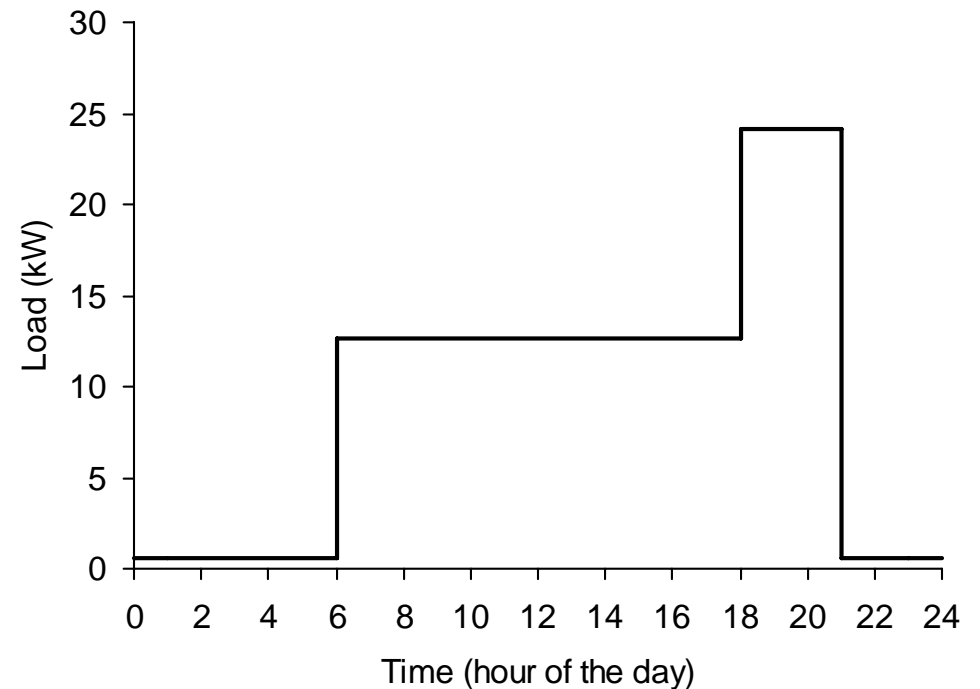
➤ Solar insolation profile

Averaged values for the month of December

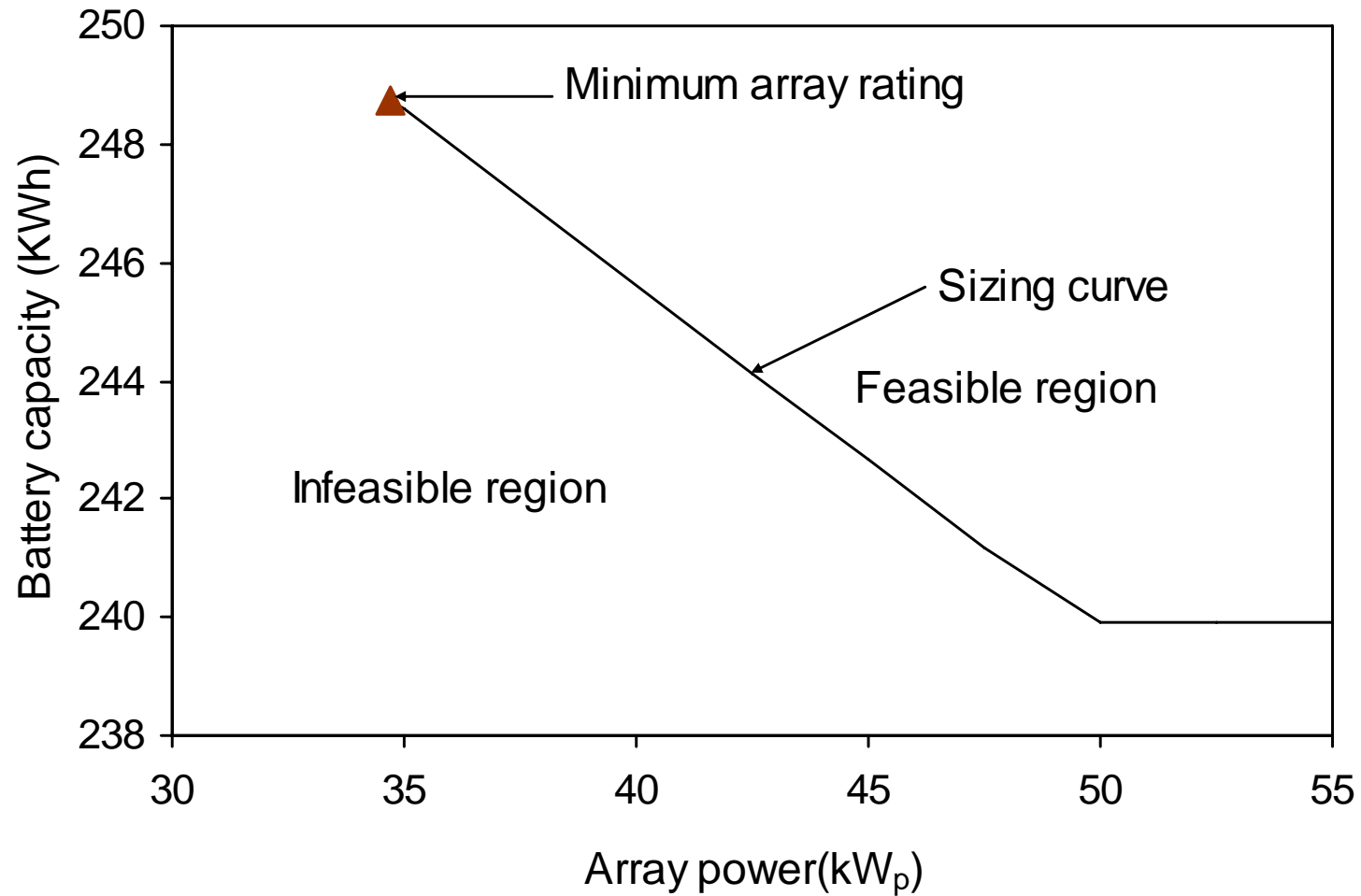


➤ Demand profile

For an average day



# Sizing curve and Design-space for the example



# Mathematical Formulations

- Chance constraint:

$$Probability\{D(t) \geq D_{actual}(t)\} \geq \alpha$$

- Incorporating energy conservation equation of the storage:

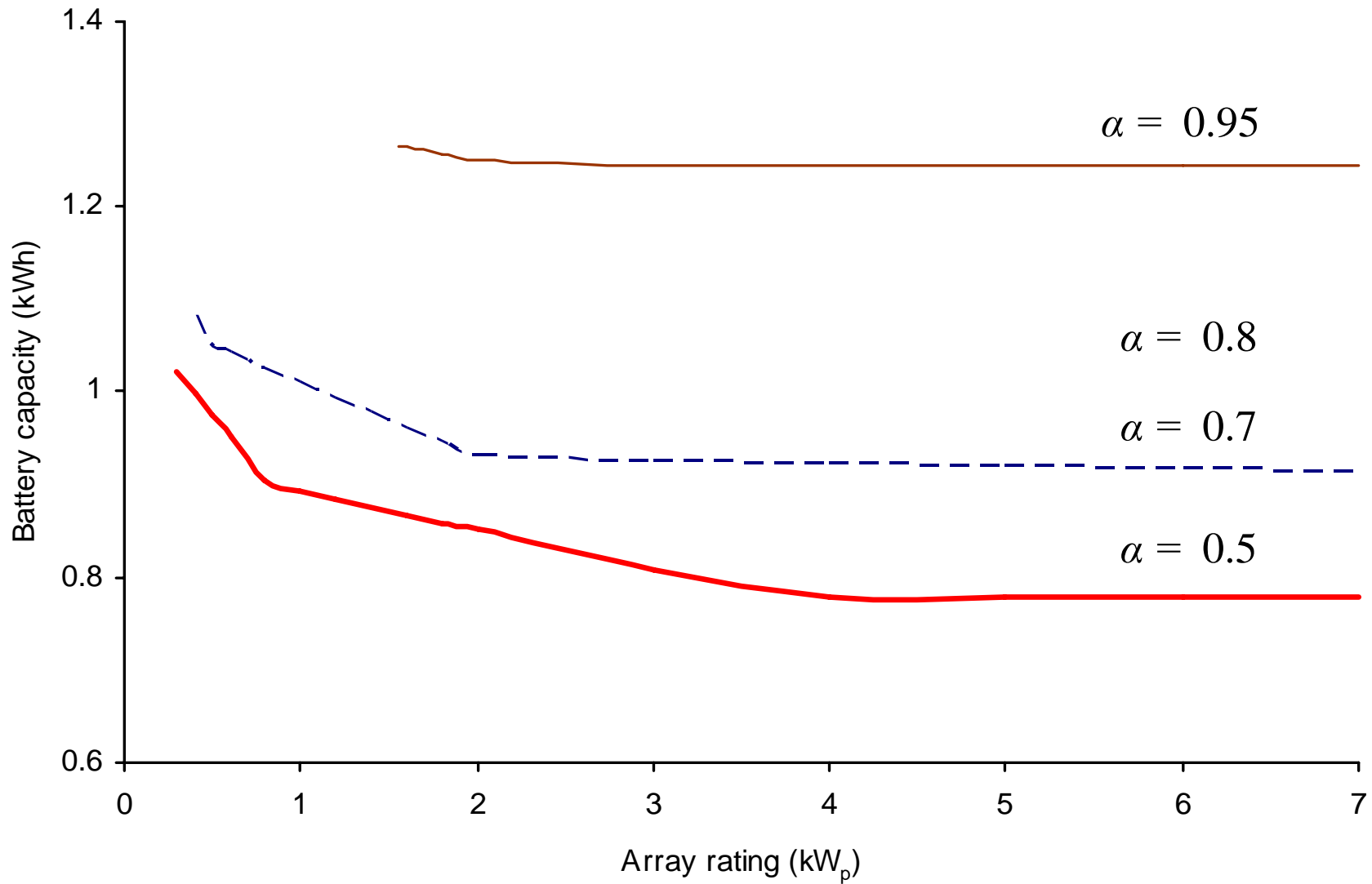
$$Probability\left\{\frac{Q_B(t + \Delta t)}{f(t)\Delta t} - \frac{Q_B(t)}{f(t)\Delta t} + D_{actual}(t) \leq P(t)\right\} \geq \alpha$$

- Deterministic equivalent:

$$\frac{Q_B(t + \Delta t)}{f(t)\Delta t} - \frac{Q_B(t)}{f(t)\Delta t} \leq (\mu_{P(t)} - D_{actual}(t) - \sigma_{P(t)} z_\alpha)$$

- Generation of design space incorporating other constraints

# PV-Battery System





# Solar Water Heaters

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- Estimate potential for solar water heaters in a given area
  - Develop generic framework
- 'Diffusion of Renewable Energy Technologies'

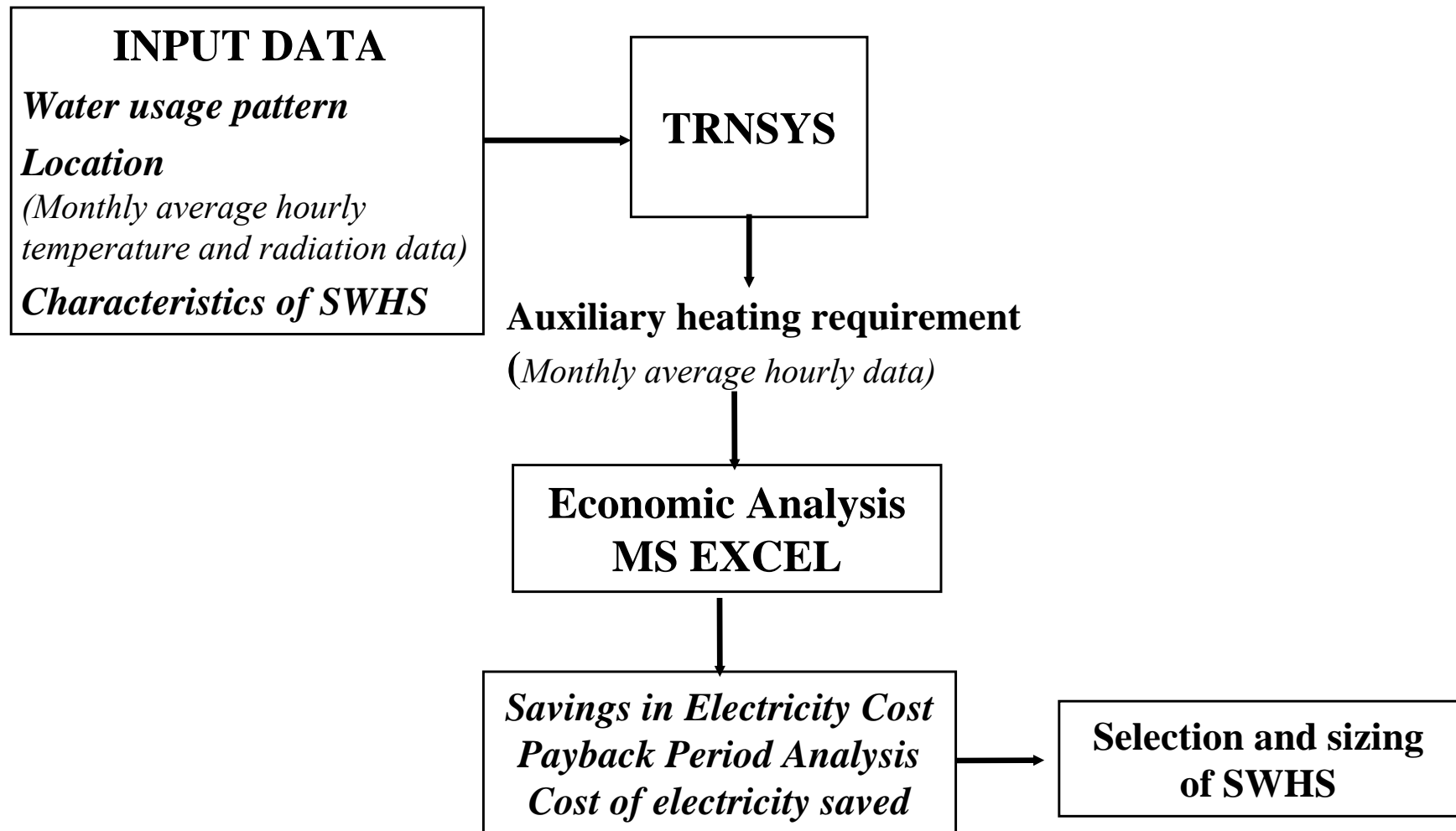


# Factors Affecting Diffusion Of SWHS

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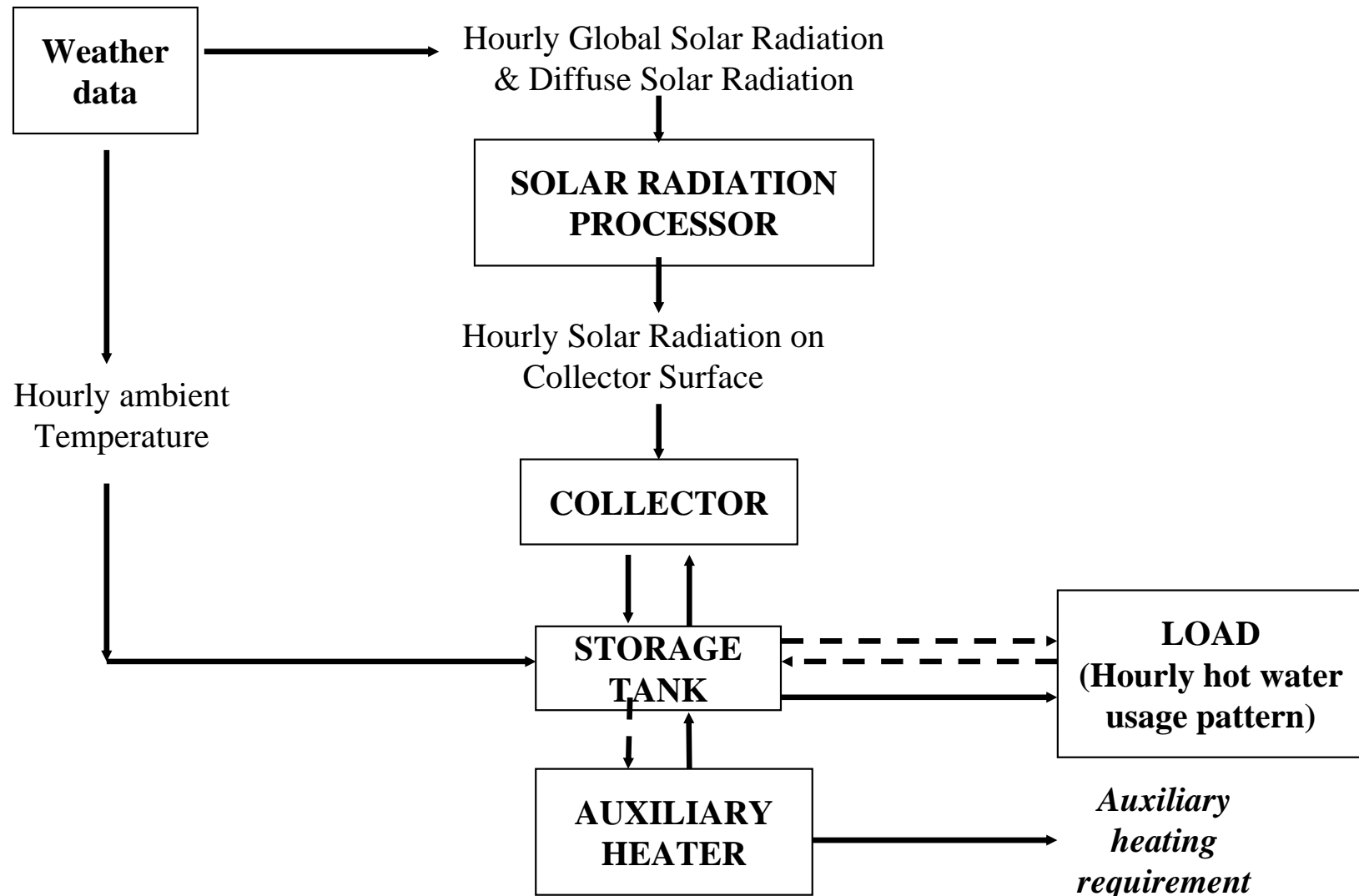
- Location- Insolation
- Water Usage Pattern
- Cost of electricity
- Capital Cost
- Reliability
- Potential savings
- Subsidies/ Financial Incentives

# Micro Level Decision Model (Parametric Analysis)

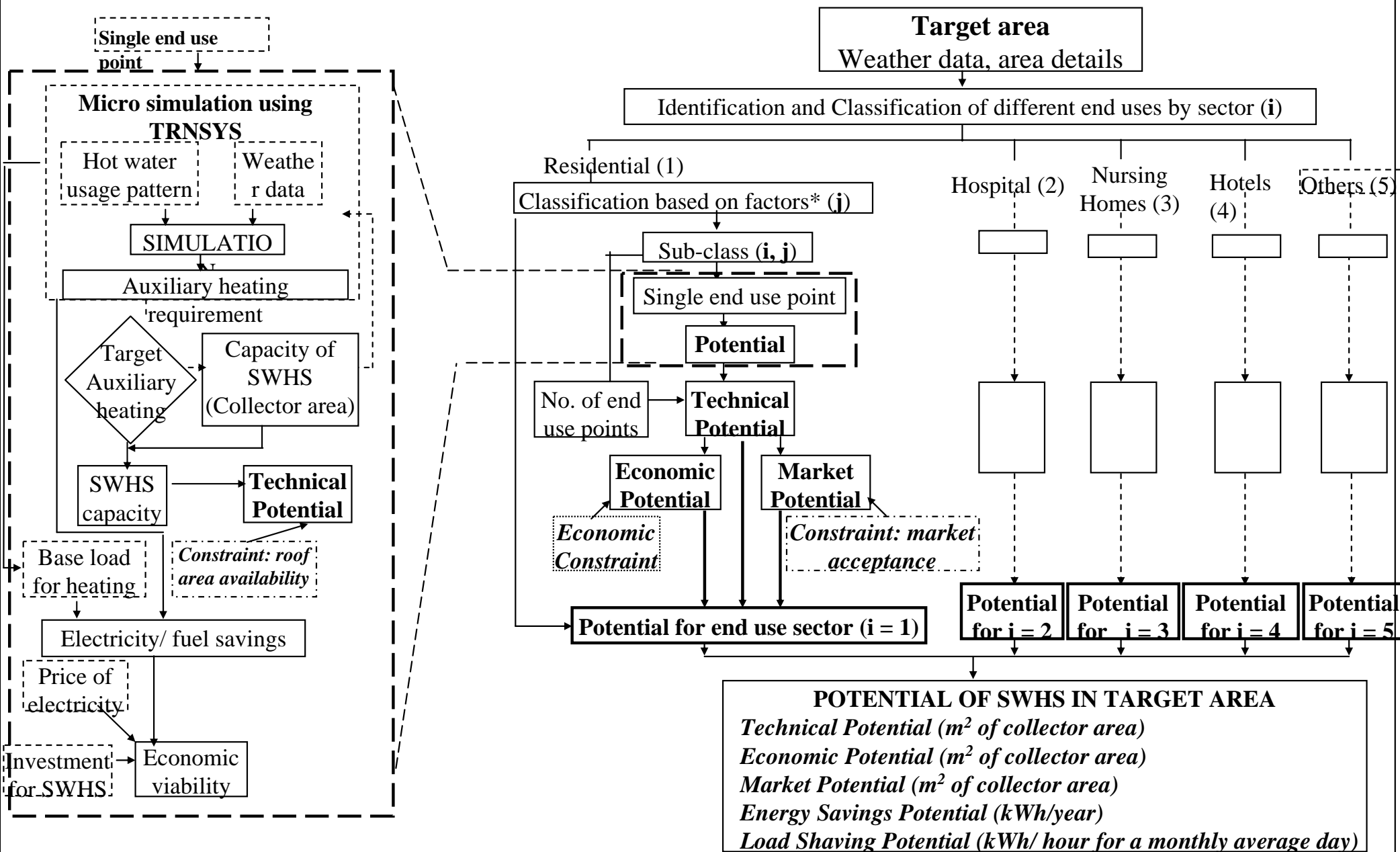


*TRNSYS (Transient System Simulation Program developed at SEL, University of Wisconsin)*

# Information Flow Diagram of Micro – simulation for SWHS



# Model for Potential Estimation of Target Area



\* Factors affecting the adoption/sizing of solar water heating systems



# Potential Of SWHS

Technical potential  $P_{ij}$  for sub-class  $j$  in sector  $i$  is

$$P_{ij} = f_j f_{aj} N_i P_{sj}$$

where  $j$  denotes sub-class of end use points in sector  $i$ .

$P_{sj}$  is the simulation output for a single end use point

$f_j$  denotes fraction of the end uses

$m$  is the total number of sub-classes.

$f_{aj}$  is fraction of roof area availability

$N_i$  is the number of end uses points in sector  $i$

Technical Potential for sector  $i$  is

$$P_i = \sum_{j=1}^m P_{ij} \quad \text{where } i \text{ denotes sector}$$

Technical Potential of SWHS  $P(T)$  in the target area is

$$P(T) = \sum P_i$$



# Economic Potential

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Economic potential of SWHS

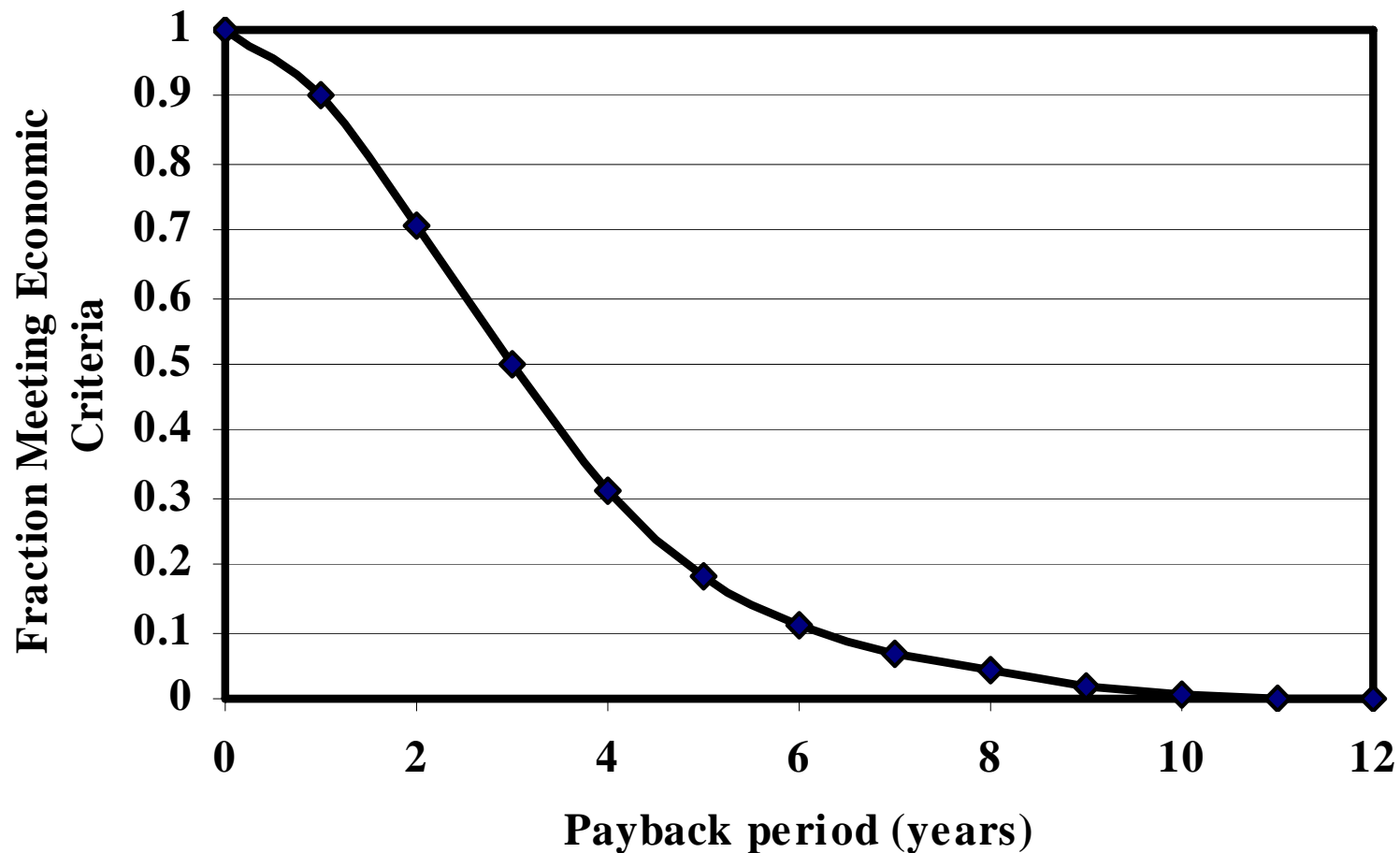
$P(E)$ : subset of technical potential

$$P(E)_{ij} = v_e P_{ij}$$

$v_e = 0$ , if payback period  $>$  maximum acceptable limit

$v_e = 1$ , if payback period  $<$  maximum acceptable limit

# Payback Acceptance Schedule



## MARKET POTENTIAL

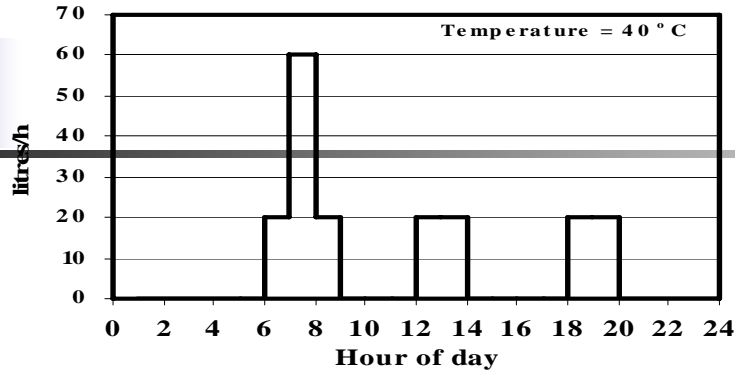
$$P(M)_{ij} = f_{pj} P_{ij}$$

$f_{p,j}$  is fraction of potential adopters meeting economic criteria.

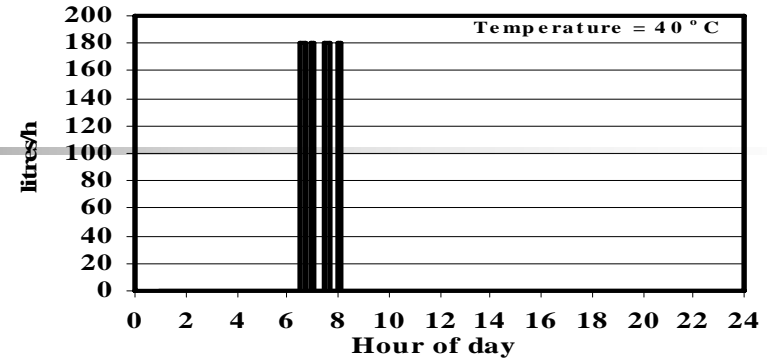
# Input Data For Potential Estimation Of SWHS in Pune

Target Area		Pune	
Area		138 sq.km	
Total Number of households		5.17 lakhs	
Number of households with more than three rooms		1.41 lakhs	
Average number of persons in each household		5	
Number of hospitals		394	
Capacity range of hospitals		1-570 beds	
Number of nursing homes		118	
Capacity range of nursing homes		1-50 beds	
Number of hotels		298	
Capacity range of hotels		10-414 inmates	
Number of households residing in single ownership houses		35250	
Number of buildings (4 flats in each floor)		6 floors	1400
		10 floors	880
		11 floors	840
Cost of electricity (Rs./kWh)	Residential	2.80	
	Commercial	4.00	

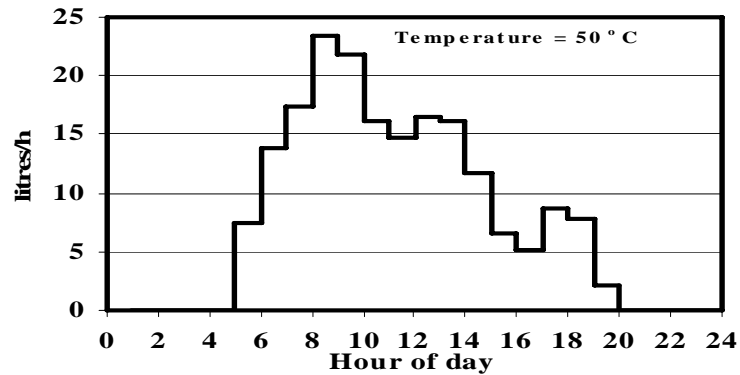
# Hot Water Usage Patterns (Pune)



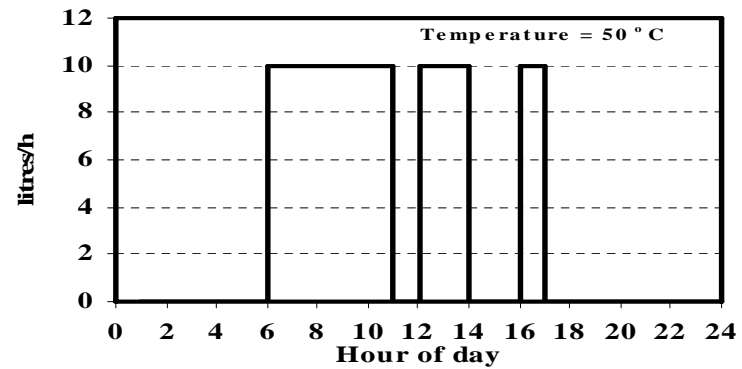
(a) Residential (1) [Gadgil, 1987]



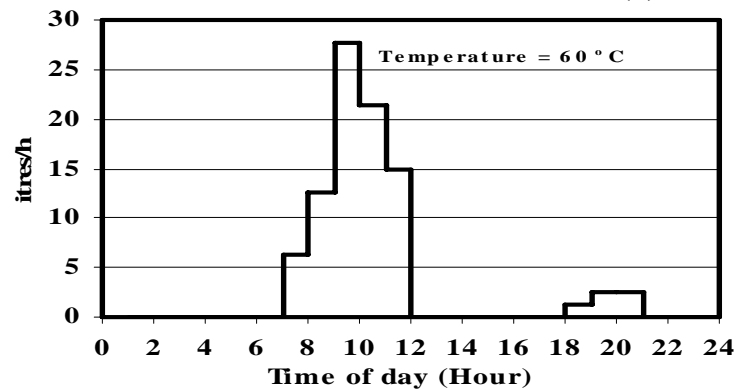
(b) Residential (2) [Narkhede, 2001]



(c) Hospital (1 bed)

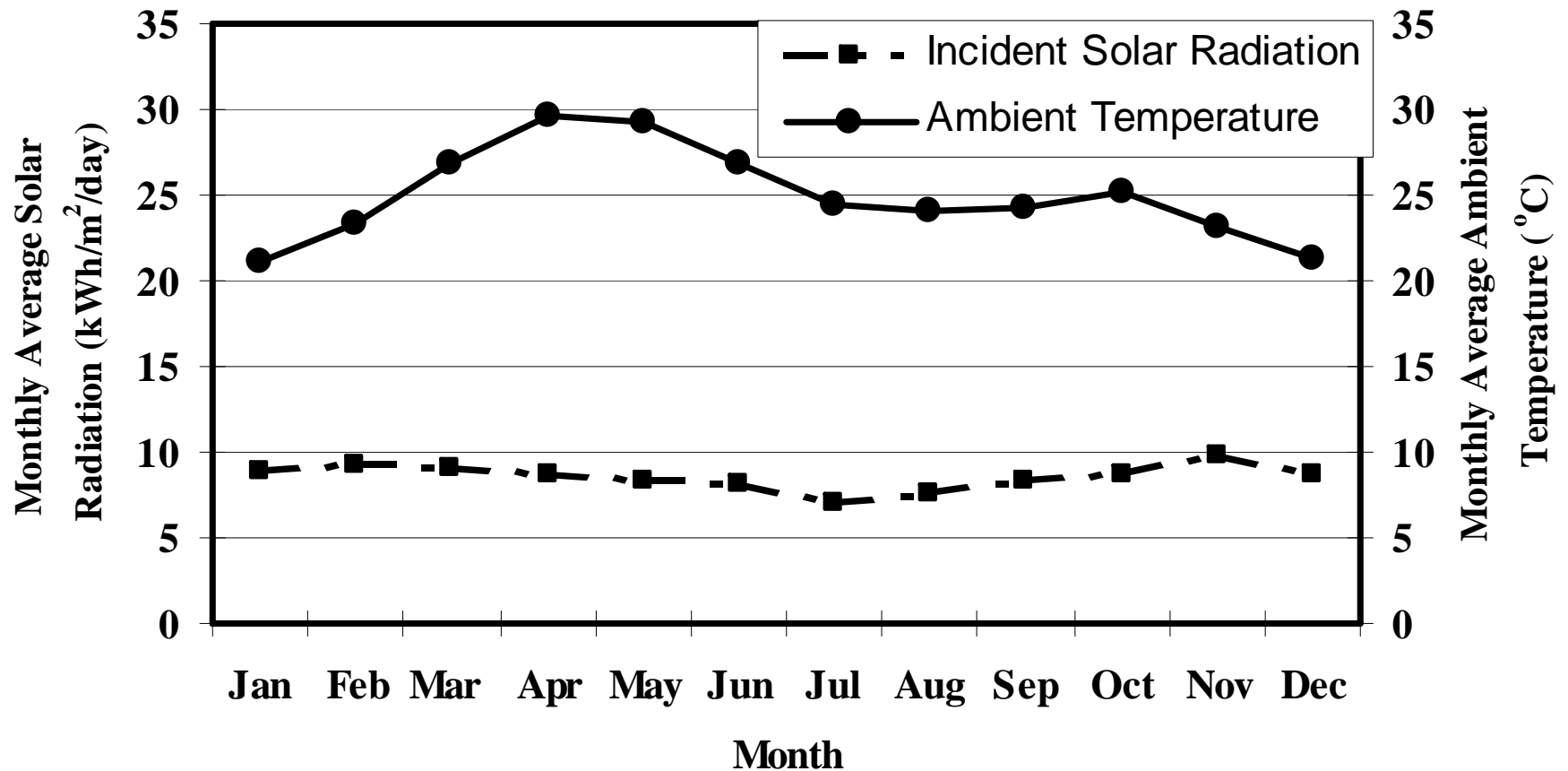


(d) Nursing Home (1 bed)



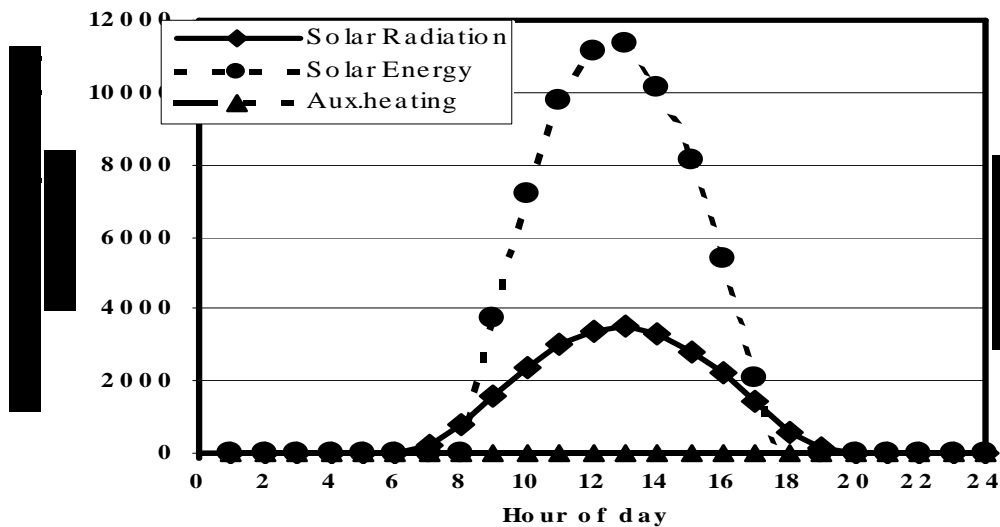
(e) Hotel - 1 guest

# Monthly Average Ambient Conditions in Pune

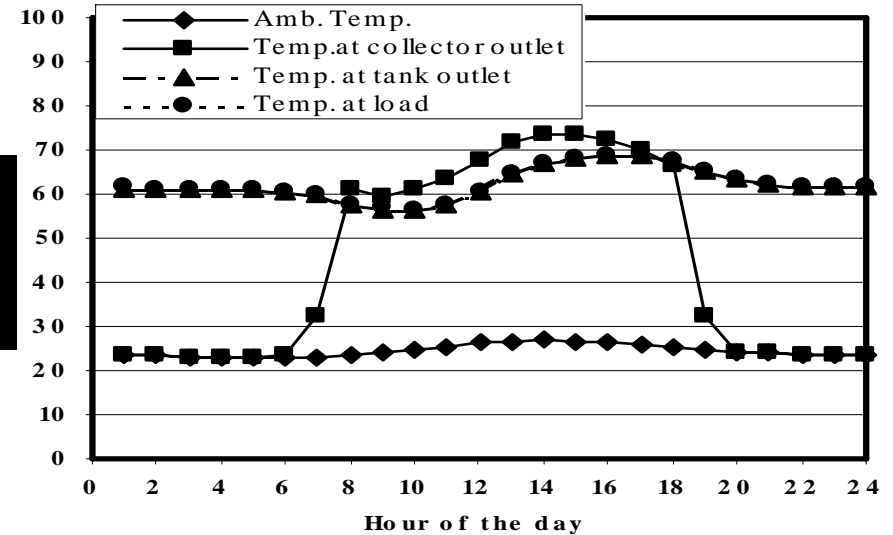


*Mani, A. (1980) 'Handbook of solar radiation data for India'.*

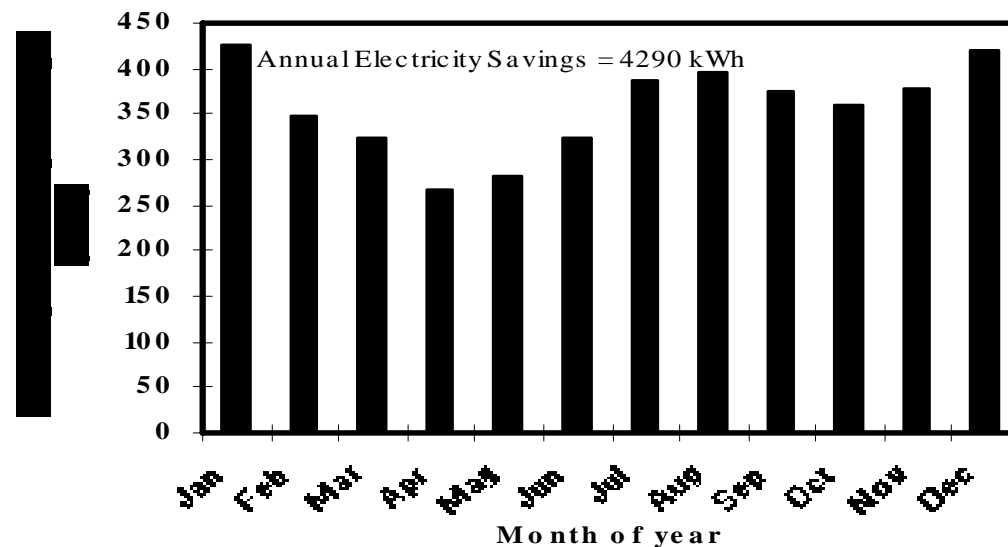
# Sample simulation output and potential estimation for hospital with 5 beds



(a) Energy flow/ Solar Radiation for a typical day



(b) Temperature profiles for a typical day

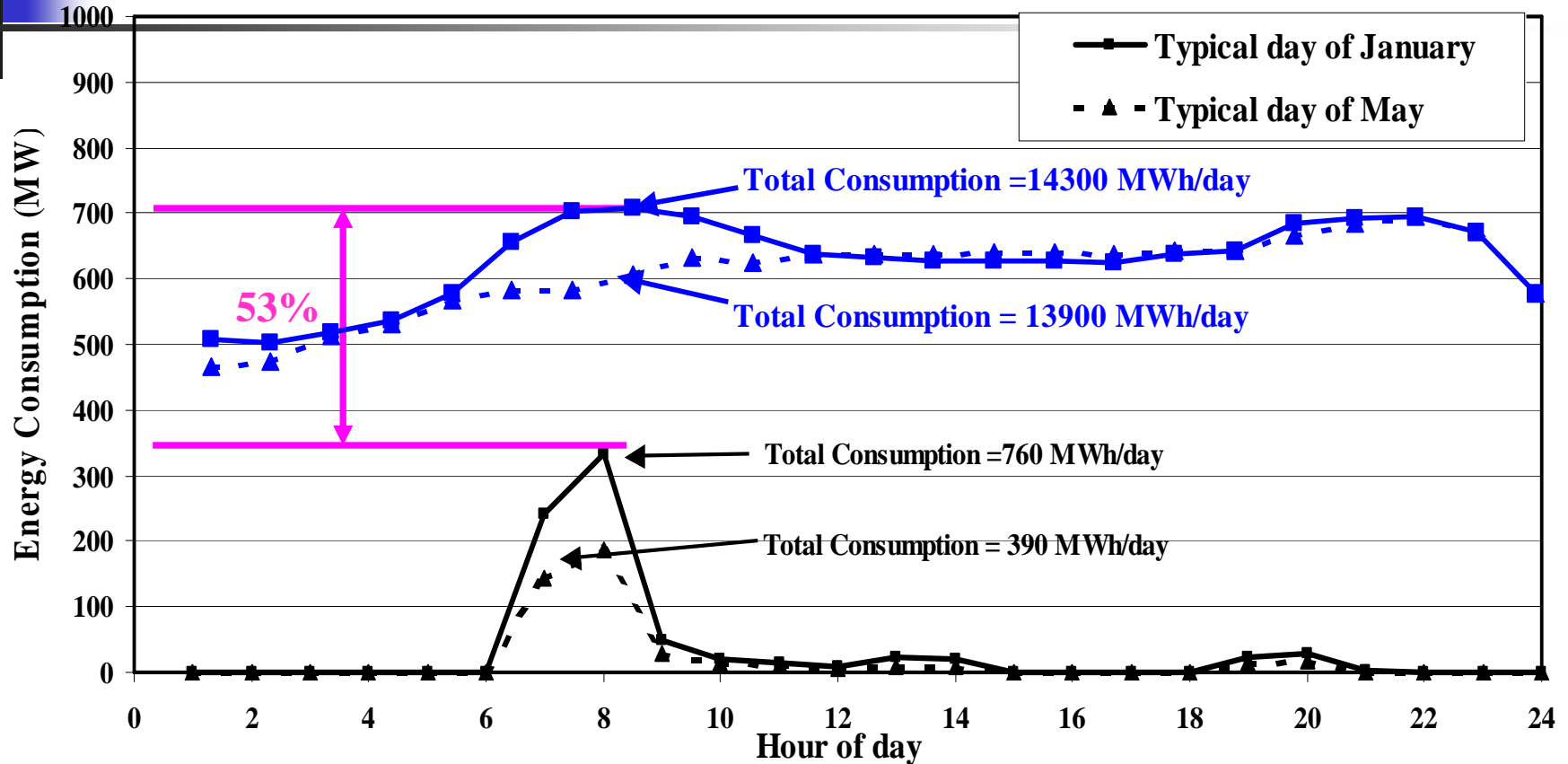


(c) Monthly variation in electricity savings

# Potential Estimation of Sectors (Pune)

Sector		Technical Potential		Market Potential	
		Collector area (m <sup>2</sup> )	Annual Electricity savings (kWh)	Collector area (m <sup>2</sup> )	Annual Electricity savings (kWh)
<b>Residential</b>	Single houses	106000	37200000	2100	740000
	Multi-storeyed	227400	165000000	41000	29700000
<b>Hospitals</b>		5500	5900000	1700	1600000
<b>Nursing homes</b>		600	500000	300	280000
<b>Hotels</b>		13800	15900000	9300	10740000
<b>TOTAL</b>		<b>353300</b>	<b>224500000</b>	<b>54400</b>	<b>43100000</b>

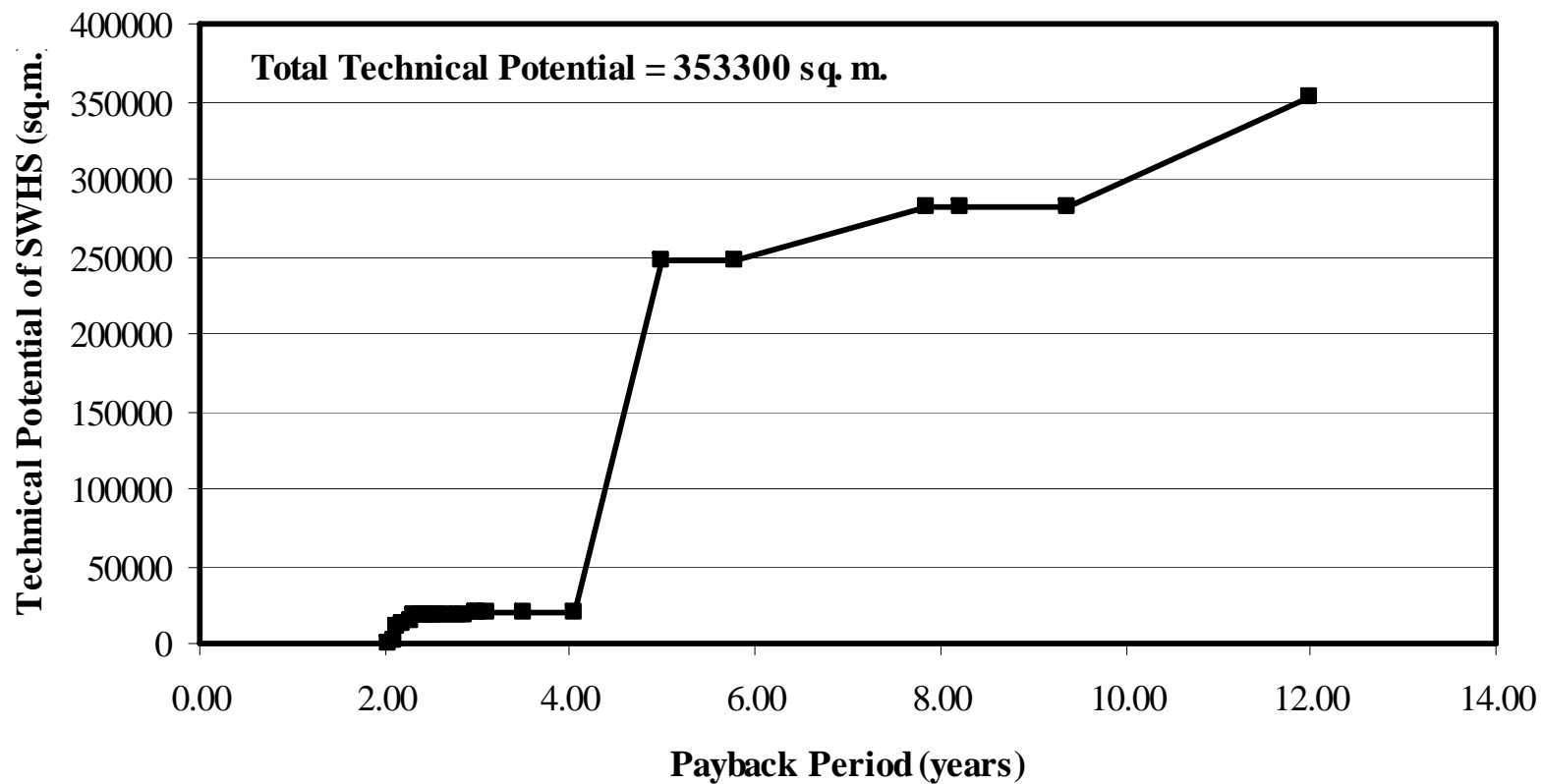
# Load Curve Representing Energy Requirement for Water Heating



 *Total Electricity Consumption of Pune*

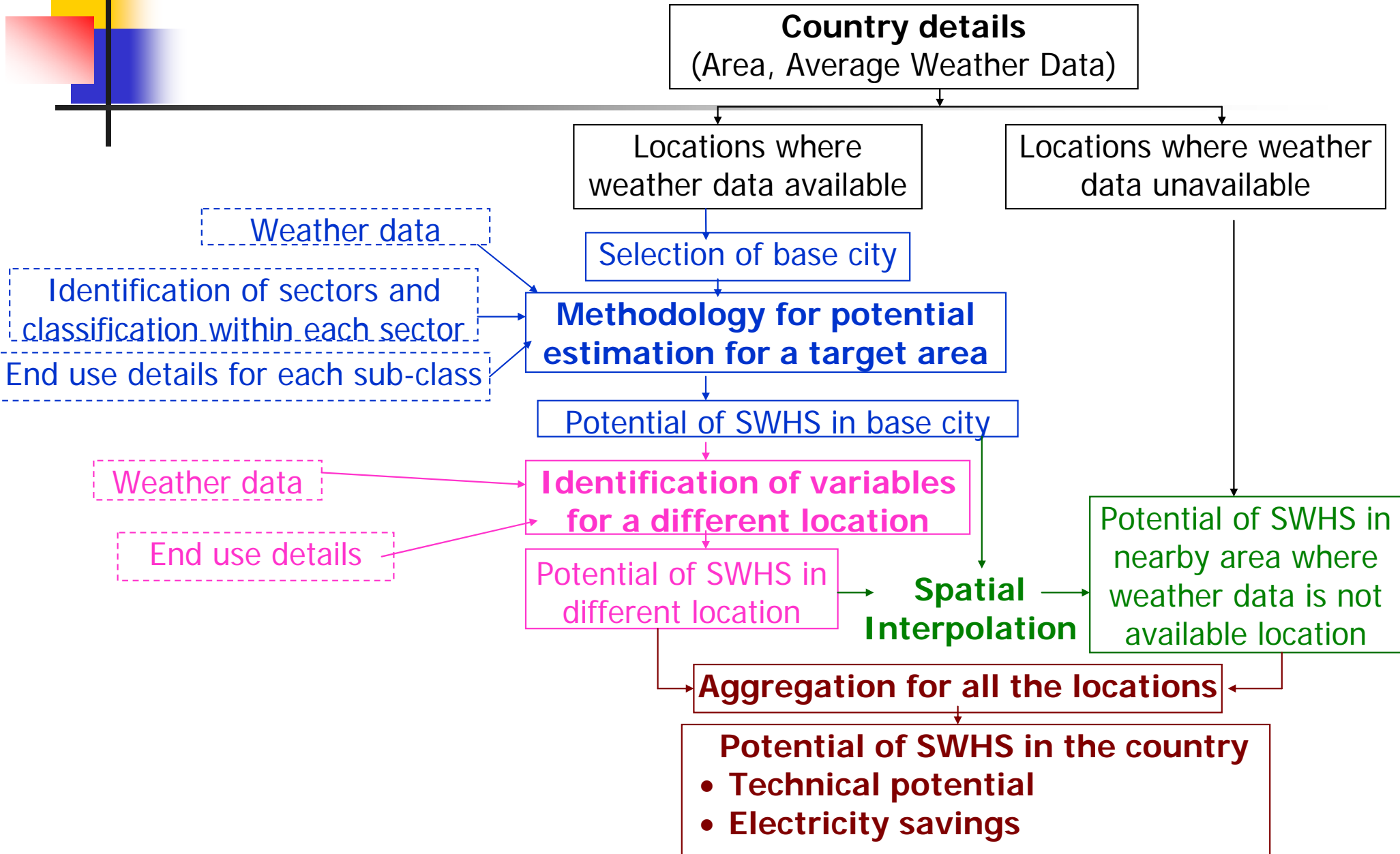
 *Electricity Consumption for water heating of Pune*

# Achievable Potential Of SWHS For Different Payback Periods (Pune)

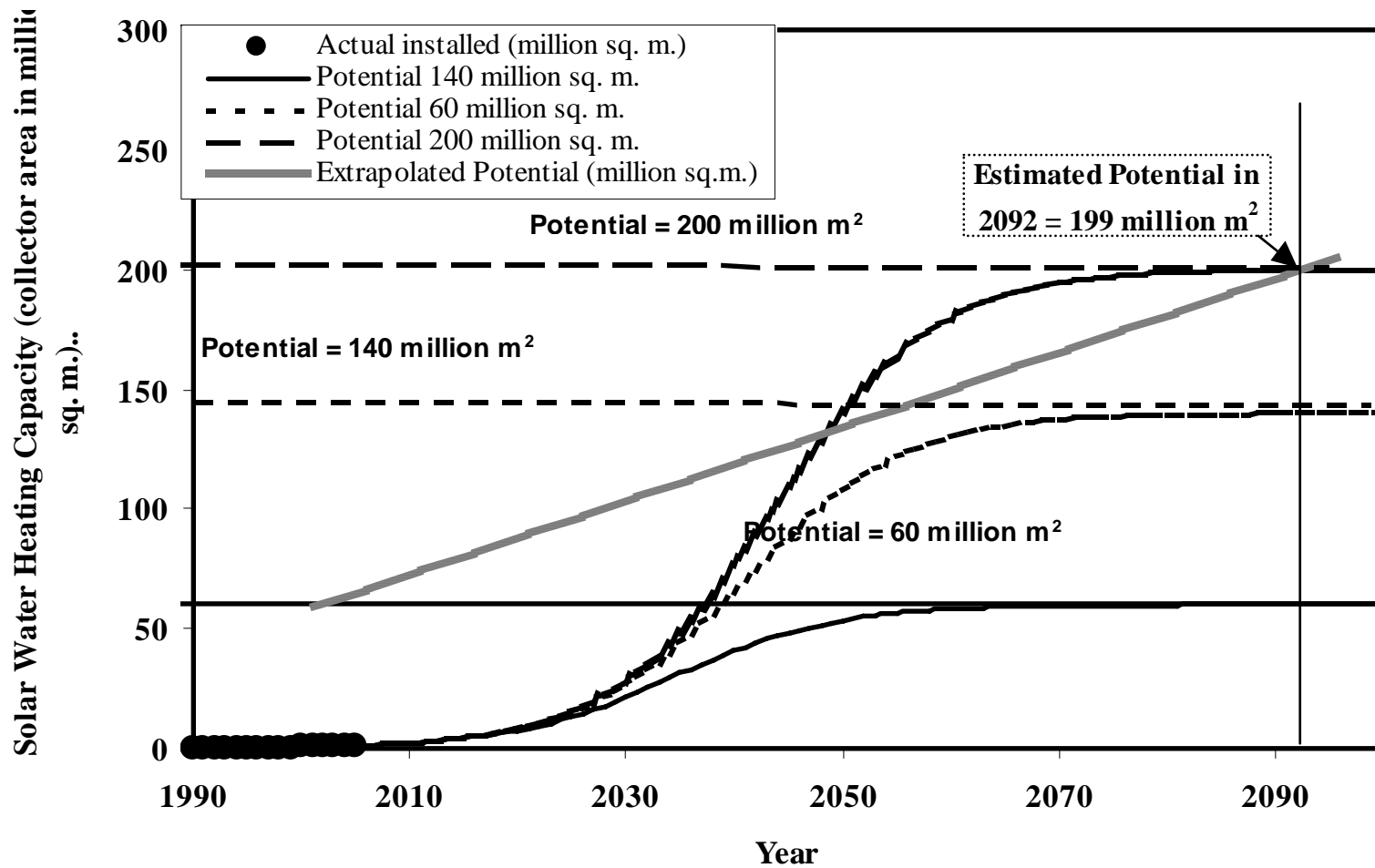


**Economic potential (limit=payback period of 5 years) =19700 m<sup>2</sup> collector area**

# Framework for Potential Estimation of Solar Water Heating Systems in a Country

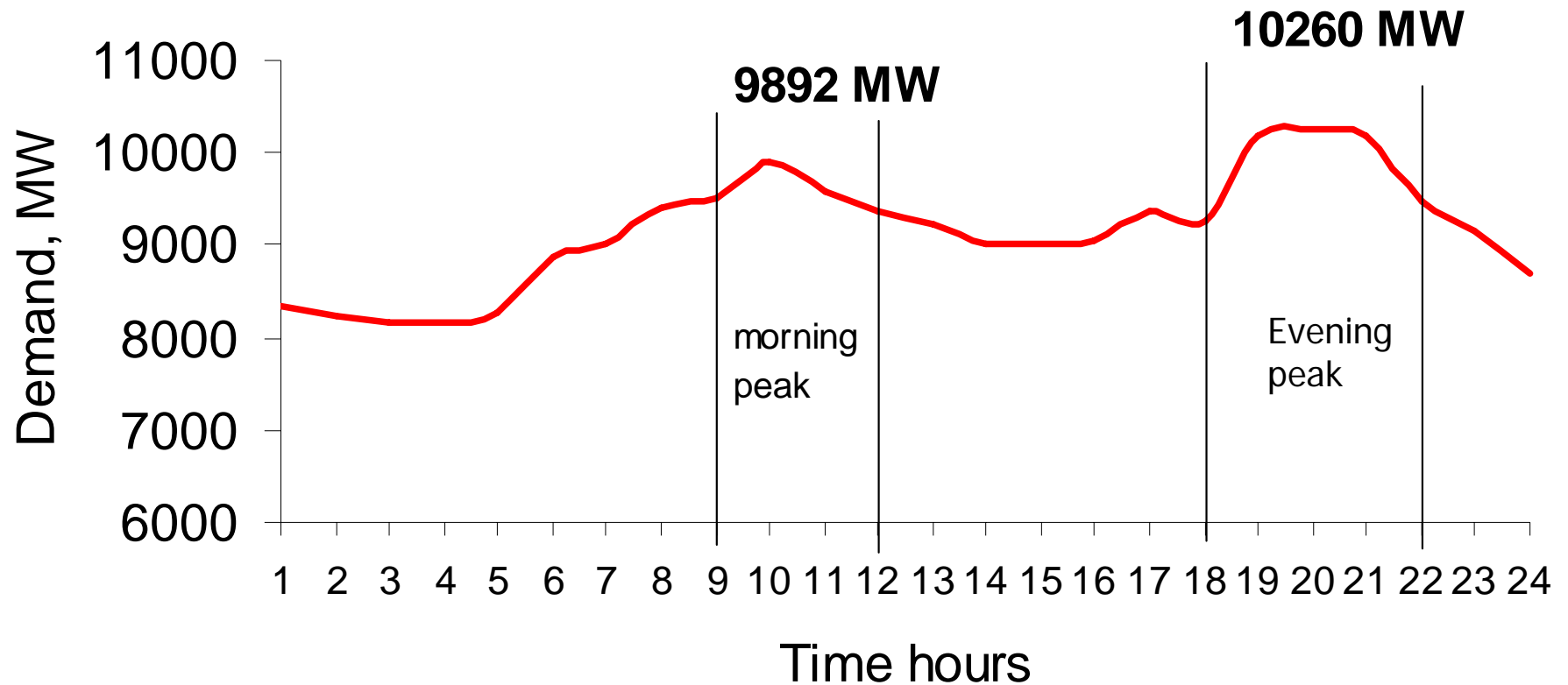


# Diffusion of SWH



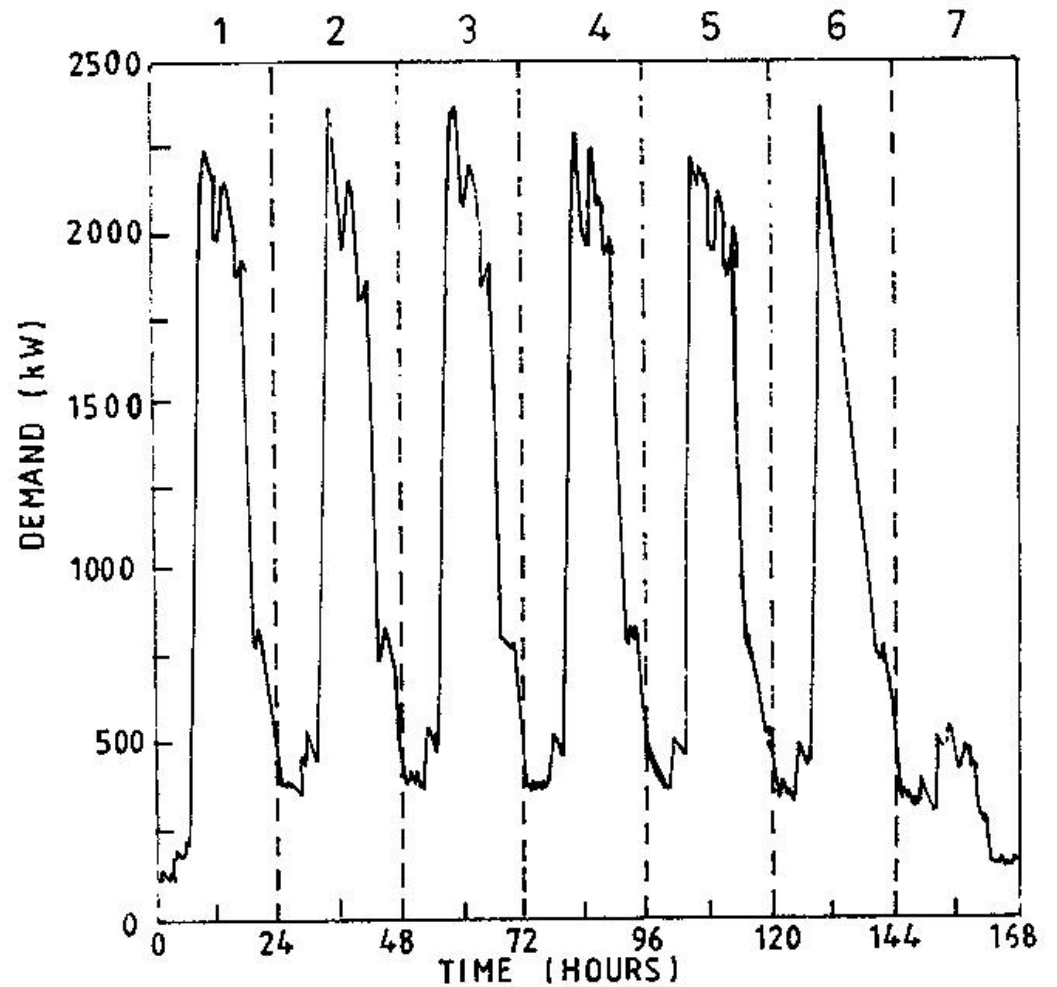
# Load curve of a typical day –MSEB

(8/11/2000 source: WREB annual report-2001)

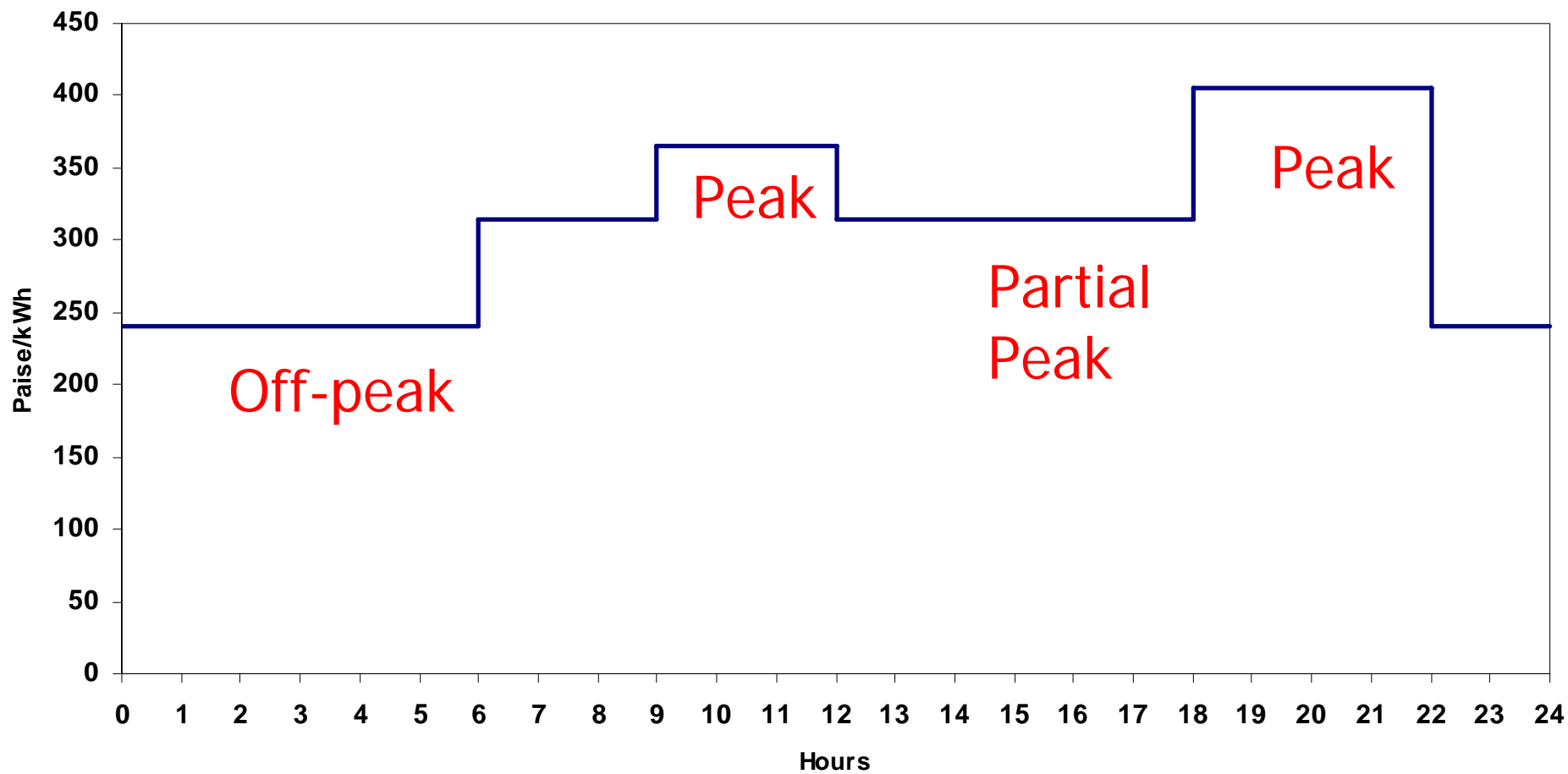


# Sample Industrial Load Profile (Mumbai)

WEEKLY LOAD CURVE



# Time of Use Tariff (MSEB-HT Ind., Jan 2002)





# ILM Research Objective

---

- Determine optimal response of industry for a specified time varying tariff –  
*develop a general model applicable for different industries*
  - Process Scheduling- Continuous/ Batch
  - Cool Storage
  - Cogeneration



# Process Scheduling

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- Variable electricity cost normally not included
- Flexibility in scheduling
- Optimisation problem – Min Annual operating costs
- Constraints – Demand, Storage and equipment
- Models developed for continuous and batch processes (Illustrated for flour mill and mini steel plant)
- Viable for Industry

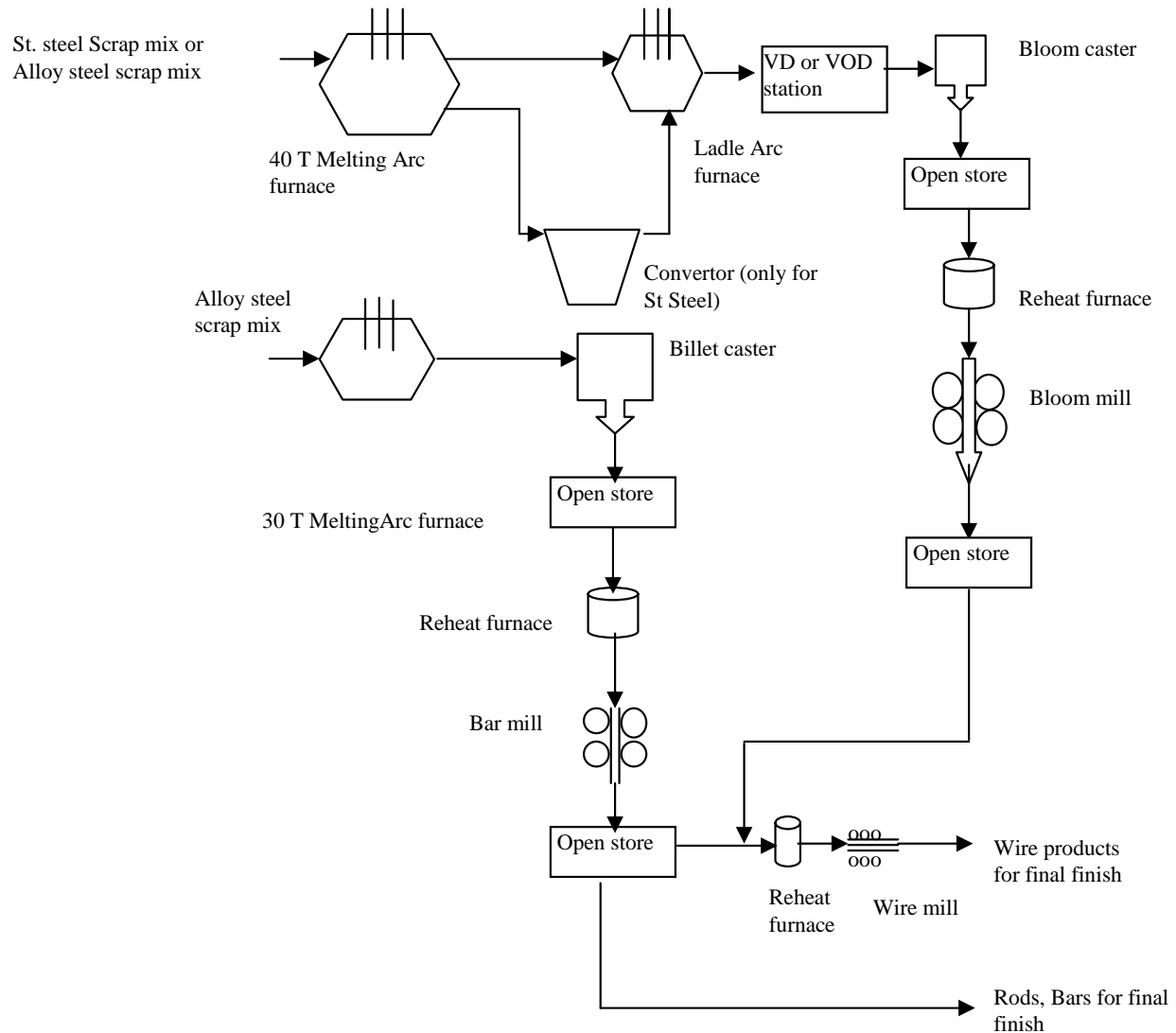


# Process Scheduling

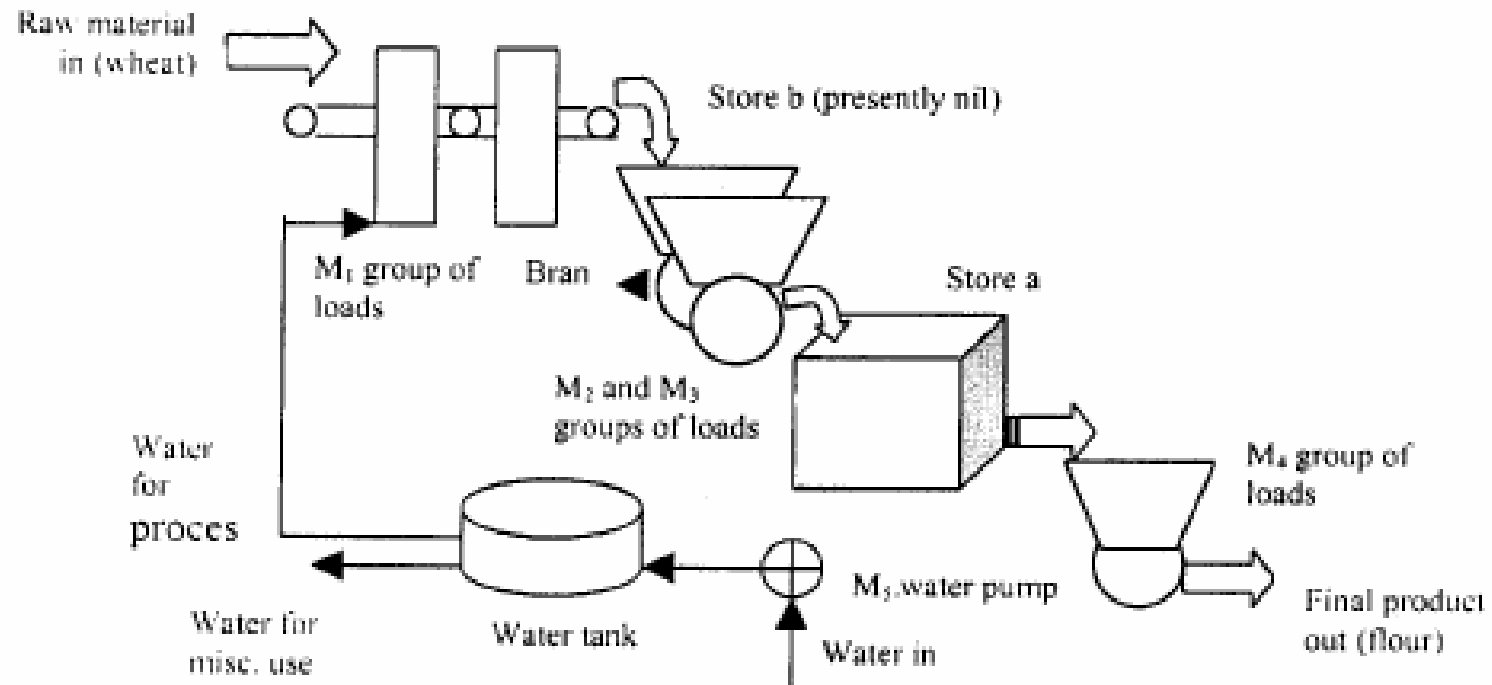
---

- Batch processes- batch time, quantity, charging, discharging, power demand variation (load cycles)
- Raw material constraints, Allocation constraints, Storage constraints, Sequential Constraints, maintenance downtime

# Steel Plant Flow Diagram



# Flour Mill



Group of process interlocked loads

M<sub>1</sub> - conveyor belts, dry stirrer, separators, washers and conditioners

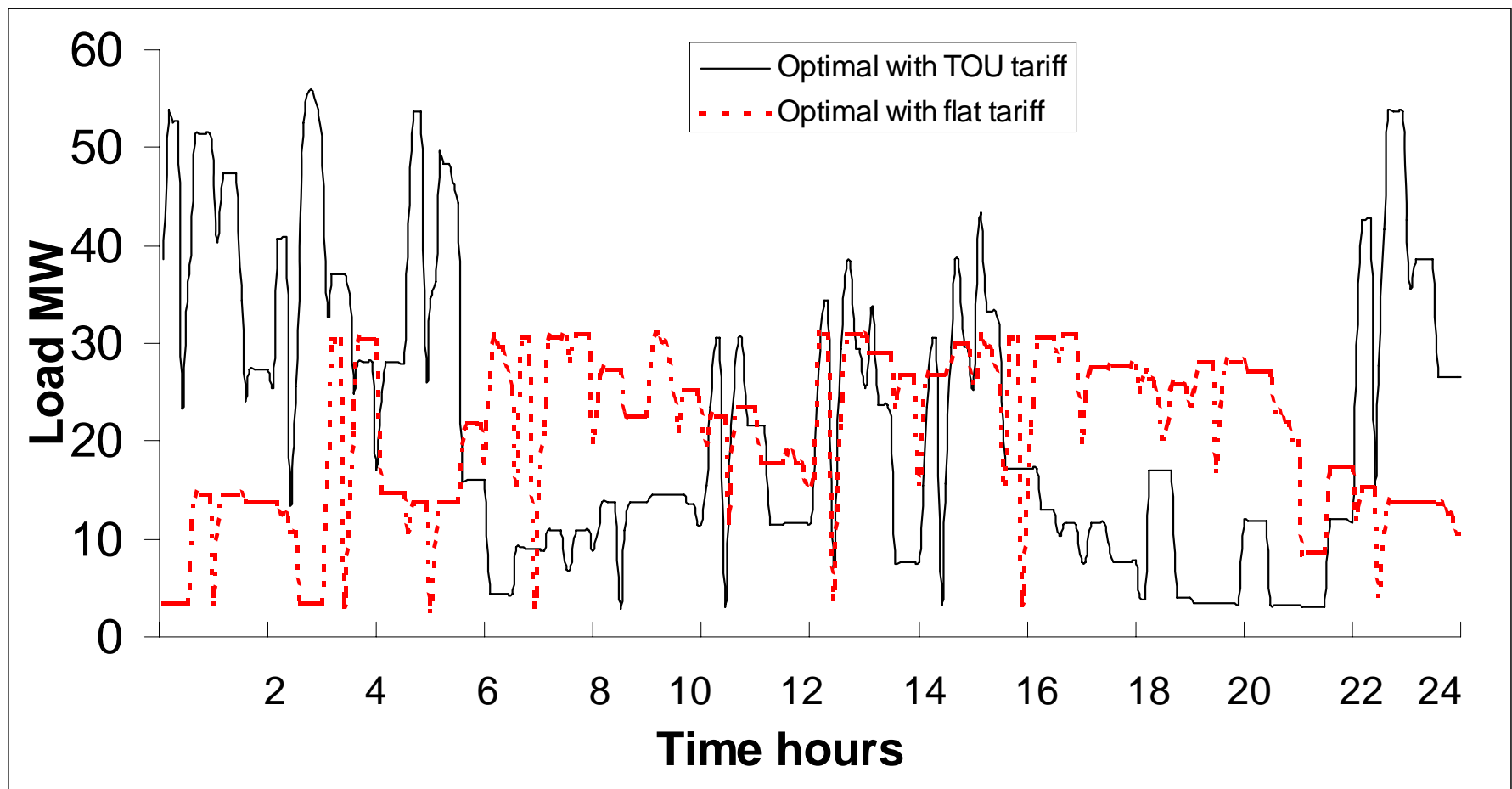
M<sub>2</sub> - grinder mills, conveyors set 1

M<sub>3</sub> - grinder mills, conveyors set 2

M<sub>4</sub> - roller mills, plansifiers, pneumatic lifters

M<sub>5</sub> - water pump

# Steel Plant Optimal Response to TOU tariff





# Process Scheduling Summary

Example	Structure	Results	Saving
Flour Mill Continuous	Linear, IP 120 variables 46 constraints	Flat- 2 shift - 25%store TOU-3 shift	1% 6.4% 75%peak reduction
Mini Steel Plant Batch	Linear, IP 432 variables 630 constraints	Flat TOU Diff loading	8% 10% 50% peak reduction



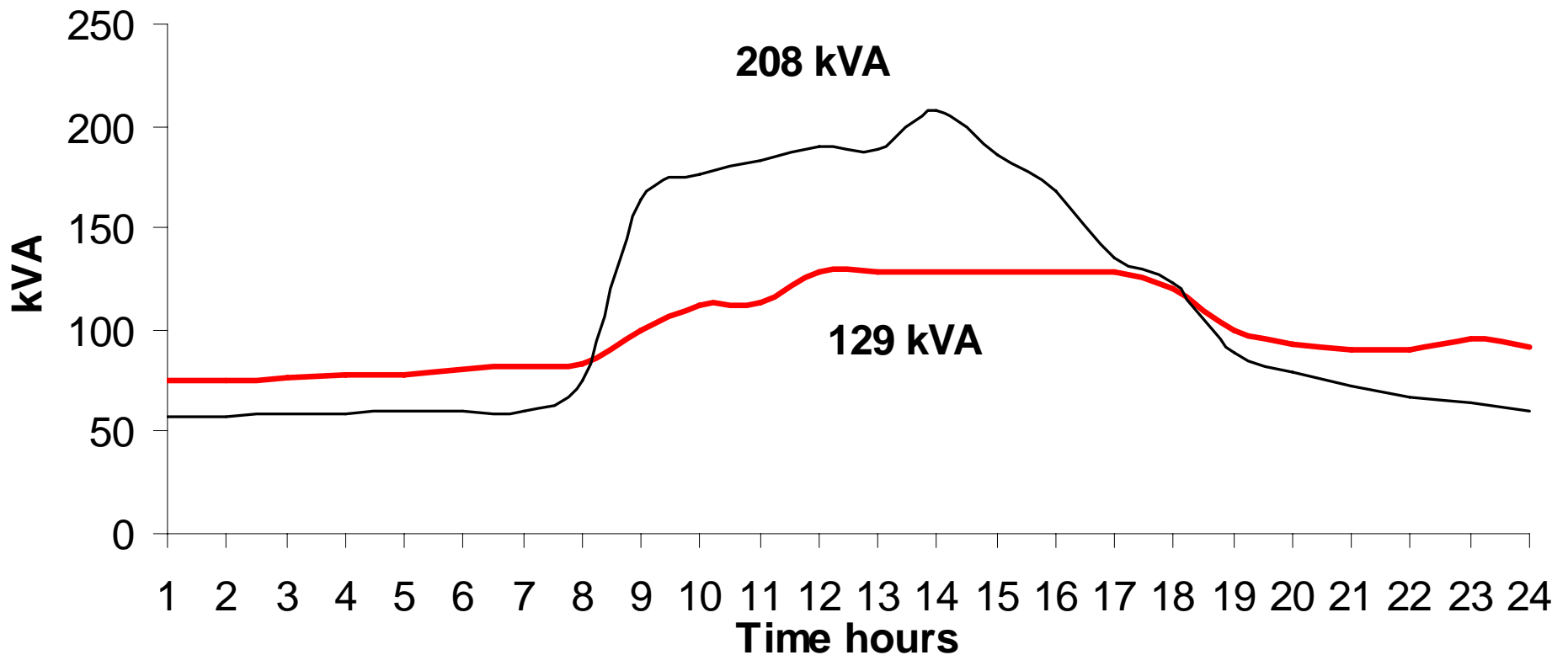
# Cool Storage

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- Cool Storage – **Chilled water** operate compressor during off-peak
- Commercial case study (BSES MDC), Industrial case study (German Remedies)
- Part load characteristics compressor, pumps
- Non- linear problem – 96 variables, Quasi Newton Method
- MD reduces from 208 kVA to 129 kVA, 10% reduction in peak co-incident demand, 6% bill saving

# Cool Storage of Commercial Complex -under TOU tariff

— with optimal cool storage  
— Load following (without storage)



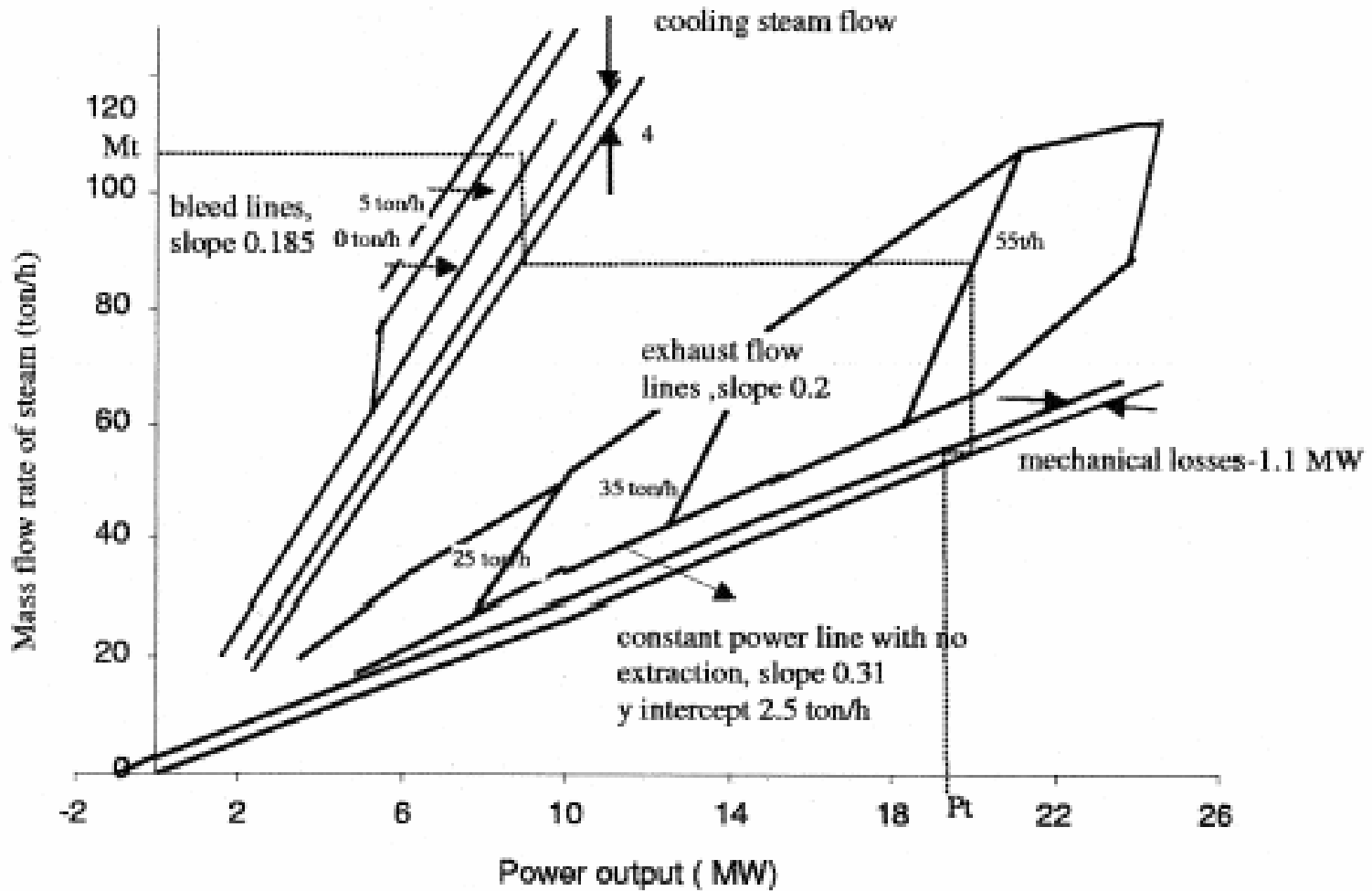


# Cogeneration

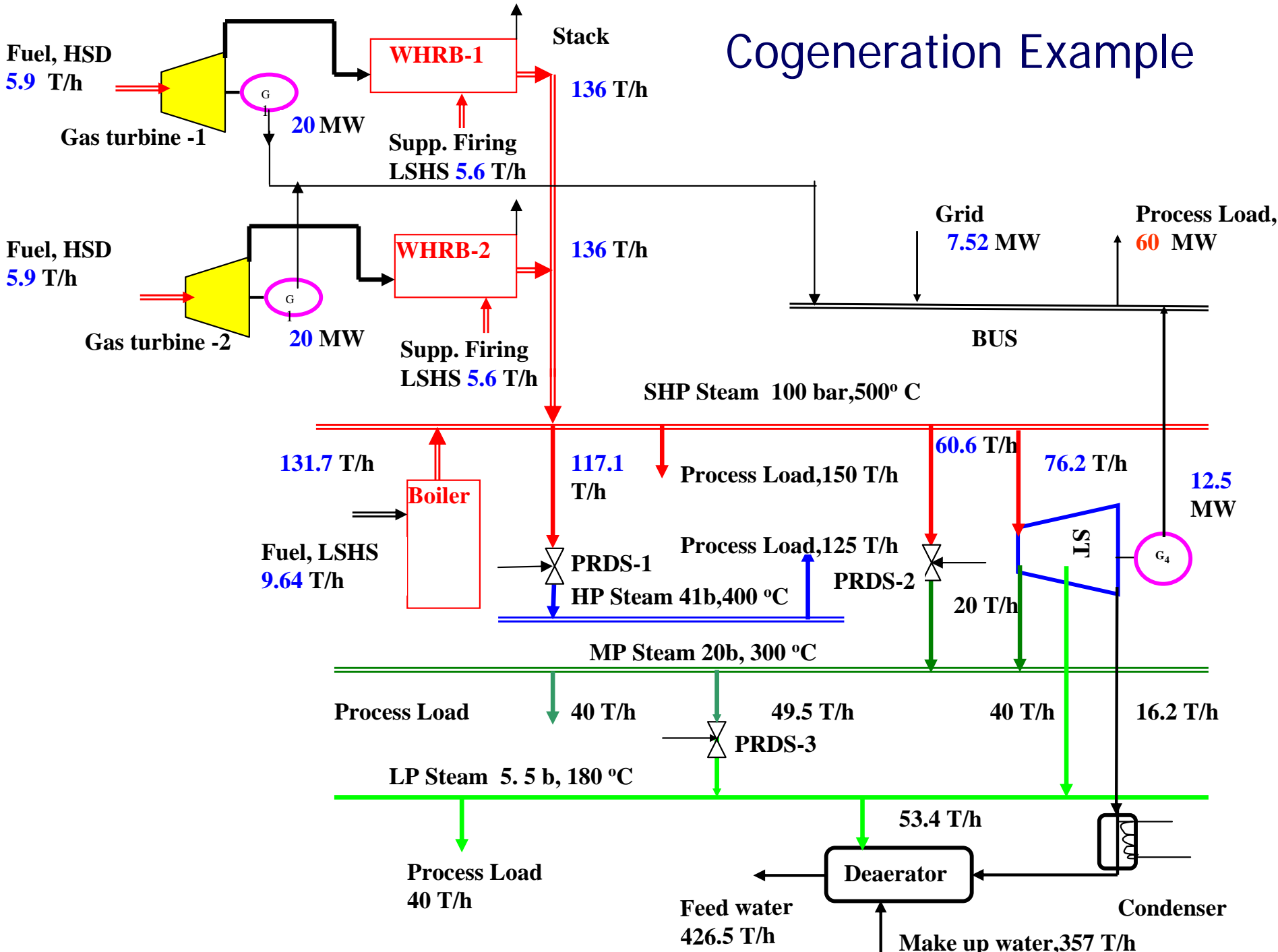
---

- Process Steam, Electricity load vary with time
- Optimal Strategy depends on grid interconnection(parallel- only buying, buying/selling) and electricity, fuel prices
- For given equipment configuration, optimal operating strategy can be determined
- GT/ST/Diesel Engine – Part load characteristics – Non Linear
- Illustrative example for petrochemical plant- shows variation in flat/TOU optimal.

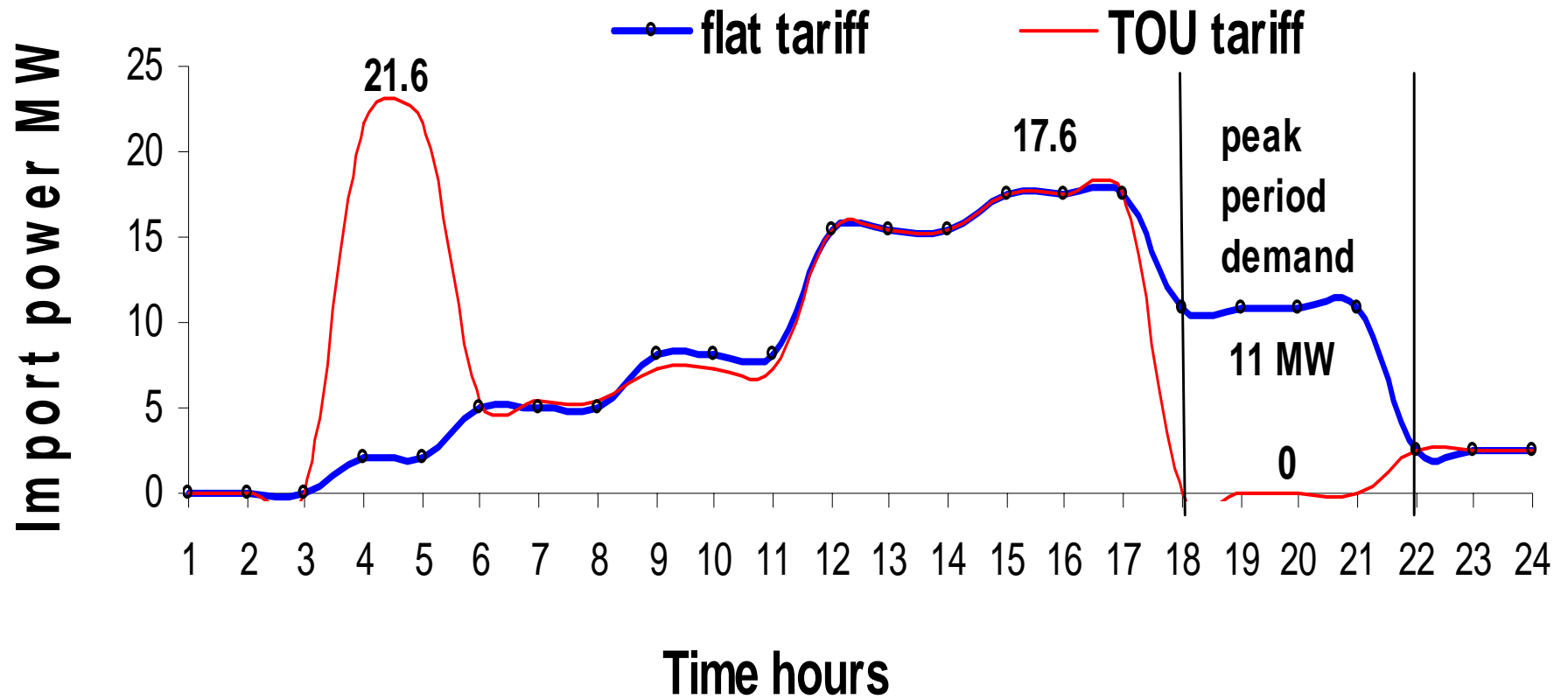
# Willans Line



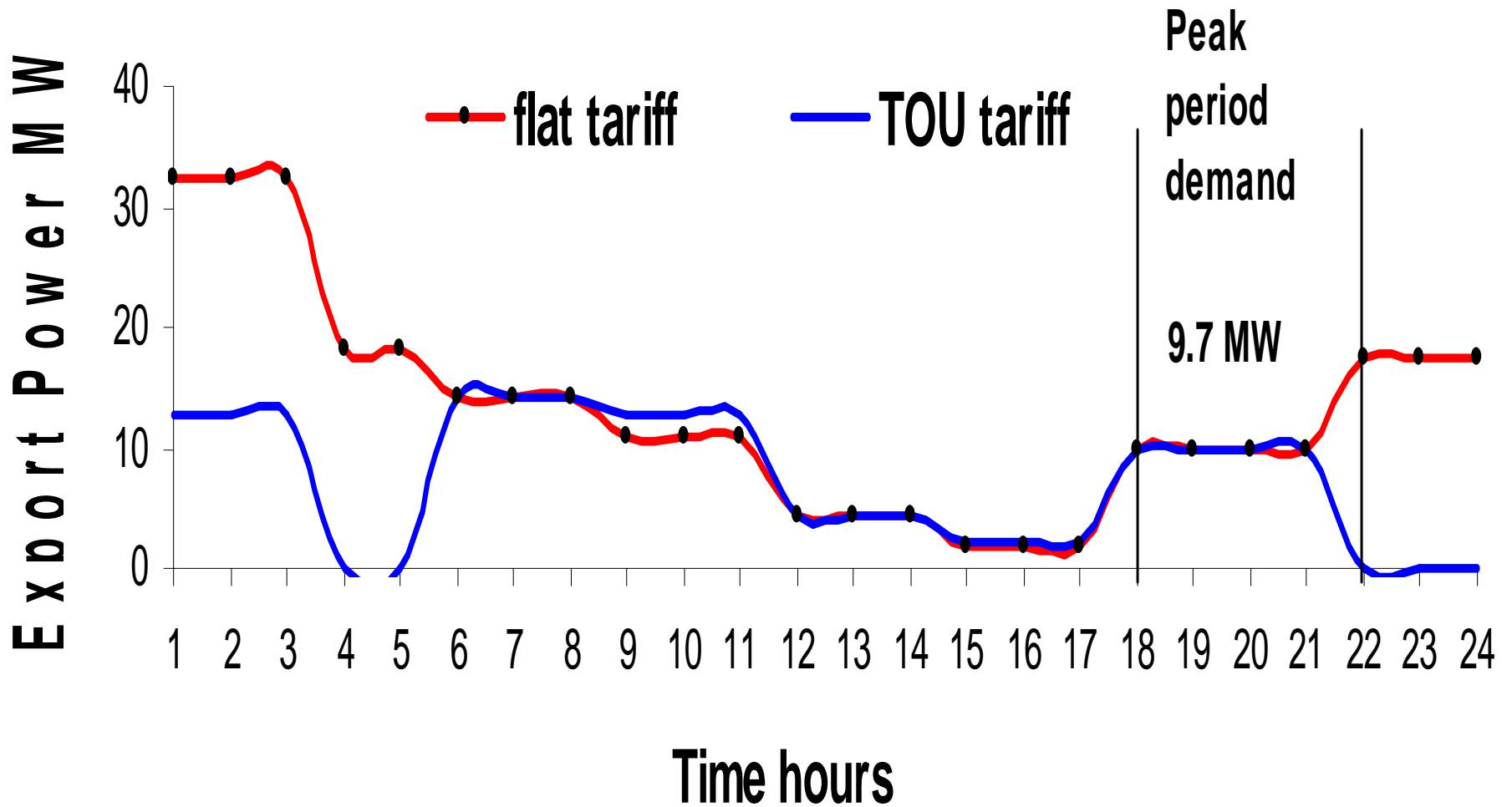
# Cogeneration Example



# Import Power from Grid with Cogeneration for a Petrochemical Plant

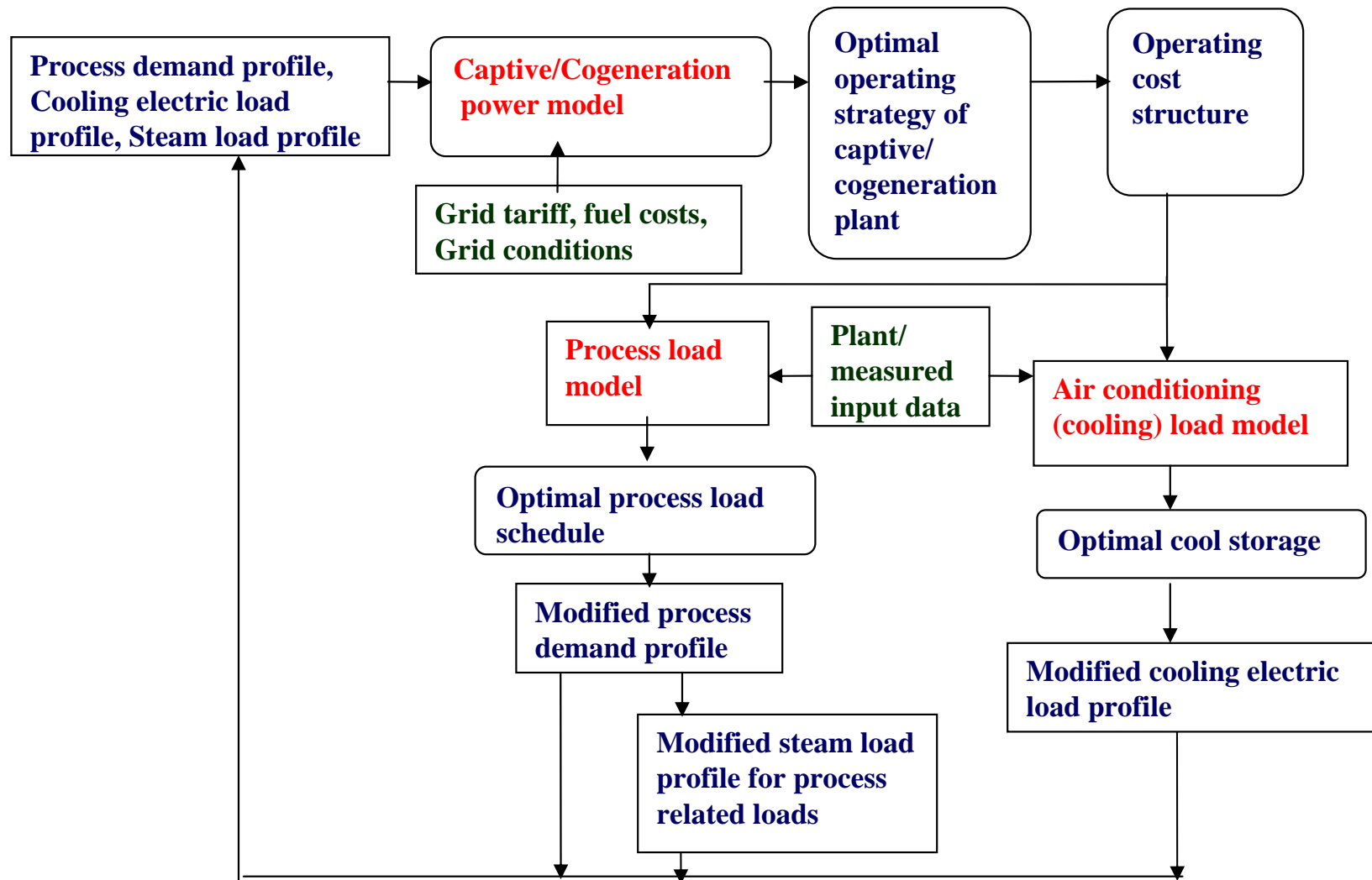


# Export power to the grid with Cogeneration for a Petrochemical Plant



# ■ Industrial Load Management

## - Integrated approach



# Glass furnace

Regenerator

Doghouse (raw material feeding section)

Melting end

Throat (processed glass outlet)

Working end

Checker work

- Classification of furnace
  - Type of firing (Cross fired / end fired)
- Raw material
  - Batch material (like silica, soda ash etc.)
  - Cullet (recycled glass)
- Heat source
  - Flame direct contact with glass
- Minimum energy requirement
  - Heating of raw material up to reaction temperature
  - Endothermic heat of reaction for batch material

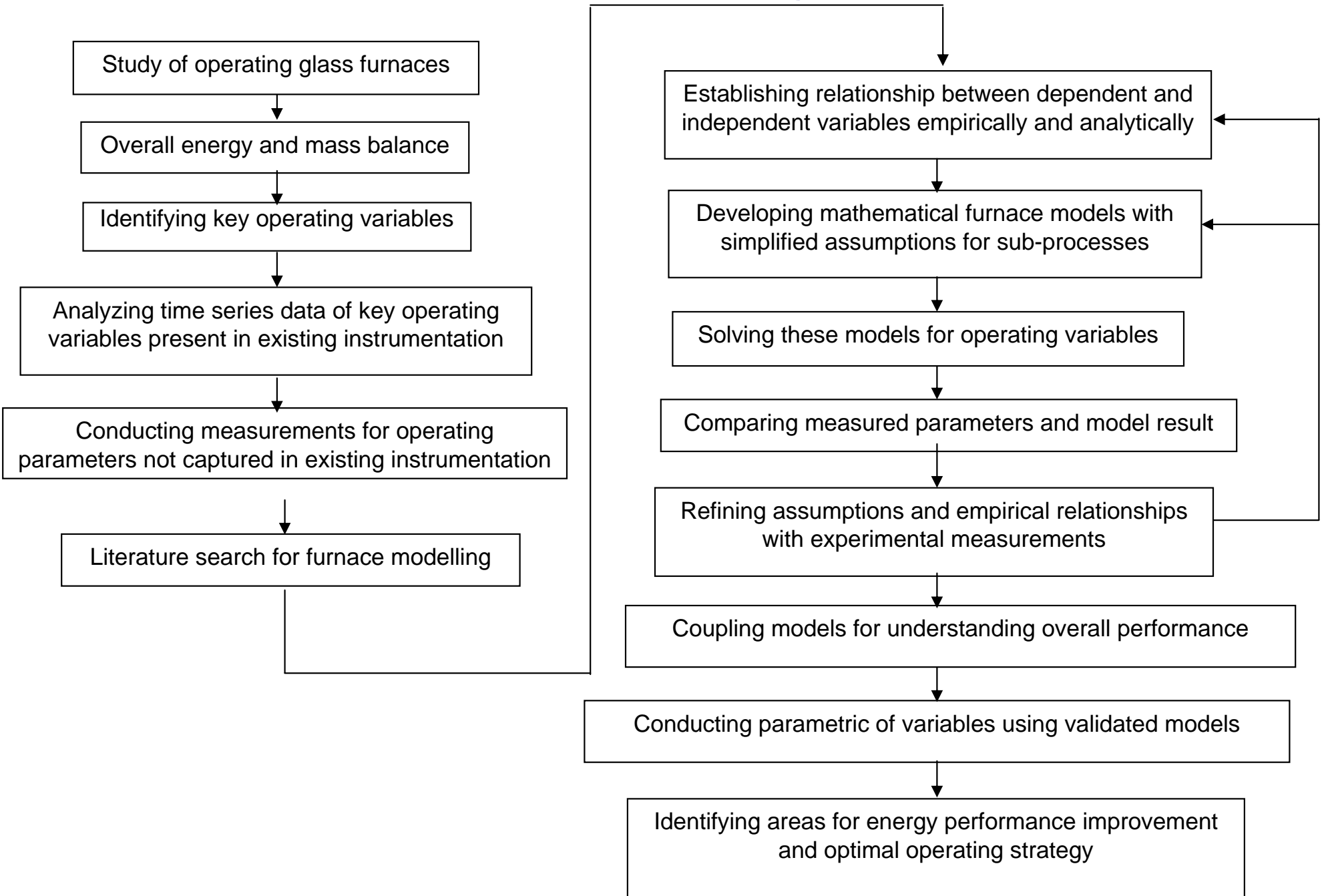


# Modeling practices for glass furnace

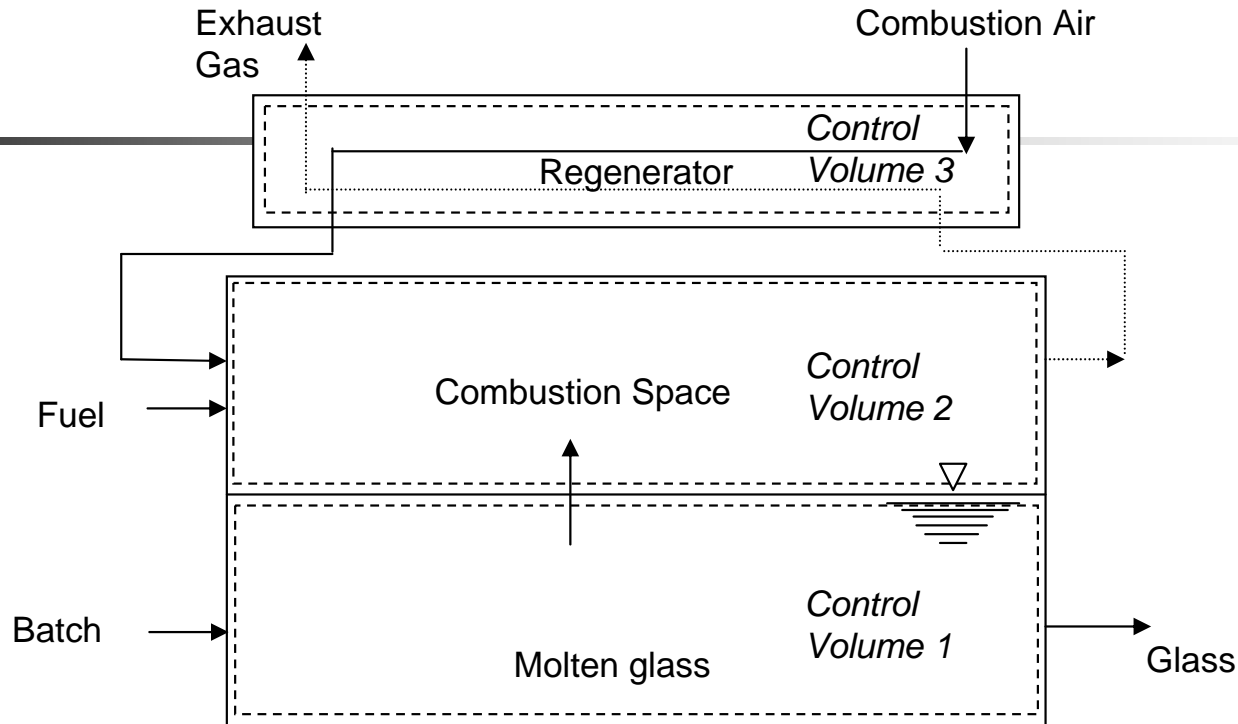
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- Continuum Process model
  - Commonly used
  - Glass furnace process in continuum equation
    - Three dimensional Navier-Stokes Equation and Hottel's zone method for radiation
- Process models used mainly troubleshooting and screening variables
- Limitations of process models
  - Data intensive inputs
  - Needs specialized skills and computational facilities to use
  - Energy performance not studied
  - Not easy to link operating parameters and impact on energy performance

# Approach for study



# Control volume



$$\dot{m}_{bh} \times h_{bh} + \dot{Q}_g = \dot{Q}_{l,wall,g} + \underbrace{\dot{m}_g \times h_g}_{\dot{Q}_{g,sensi}} + \underbrace{\dot{m}_g \times \sum h_{rk}}_{\dot{Q}_{g,rk}} + \underbrace{\dot{m}_{bh,f} \times h_{bh,f}}_{\dot{Q}_{bh,f}} + \underbrace{\dot{m}_w \times (h_{w,100^\circ C} + h_{w,lat})}_{\dot{Q}_w} \quad \text{Eq. 1}$$

$$\underbrace{\dot{m}_{fu} \times CV}_{\dot{Q}_{fu}} + \underbrace{(\dot{m}_{comb,air,nonreg} + \dot{m}_{noncomb,air,nonreg}) \times h_{air,\infty}}_{\dot{Q}_{air,nonreg}} + \underbrace{\dot{m}_{air,comb,reg} \times h_{air,comb,reg}}_{\dot{Q}_{air,reg}} = \dot{Q}_{l,wall,comb} + \dot{Q}_g + \underbrace{\dot{m}_{tot,f} \times h_f}_{\dot{Q}_{l,reg,f}} \quad \text{Eq. 2}$$

$$\dot{m}_{f,tot,in} \times h_{f,in} + \dot{m}_{air,leak,reg} \times h_{air,leak} = \dot{m}_{f,tot,out} \times h_{f,out} + \dot{Q}_{l,wall,reg} + \dot{m}_{air,comb,reg} \times (h_{air,comb,reg,out} - h_{air,comb,reg,in}) \quad \text{Eq. 3}$$



# Mass balance of furnace

---

## ■ Input streams

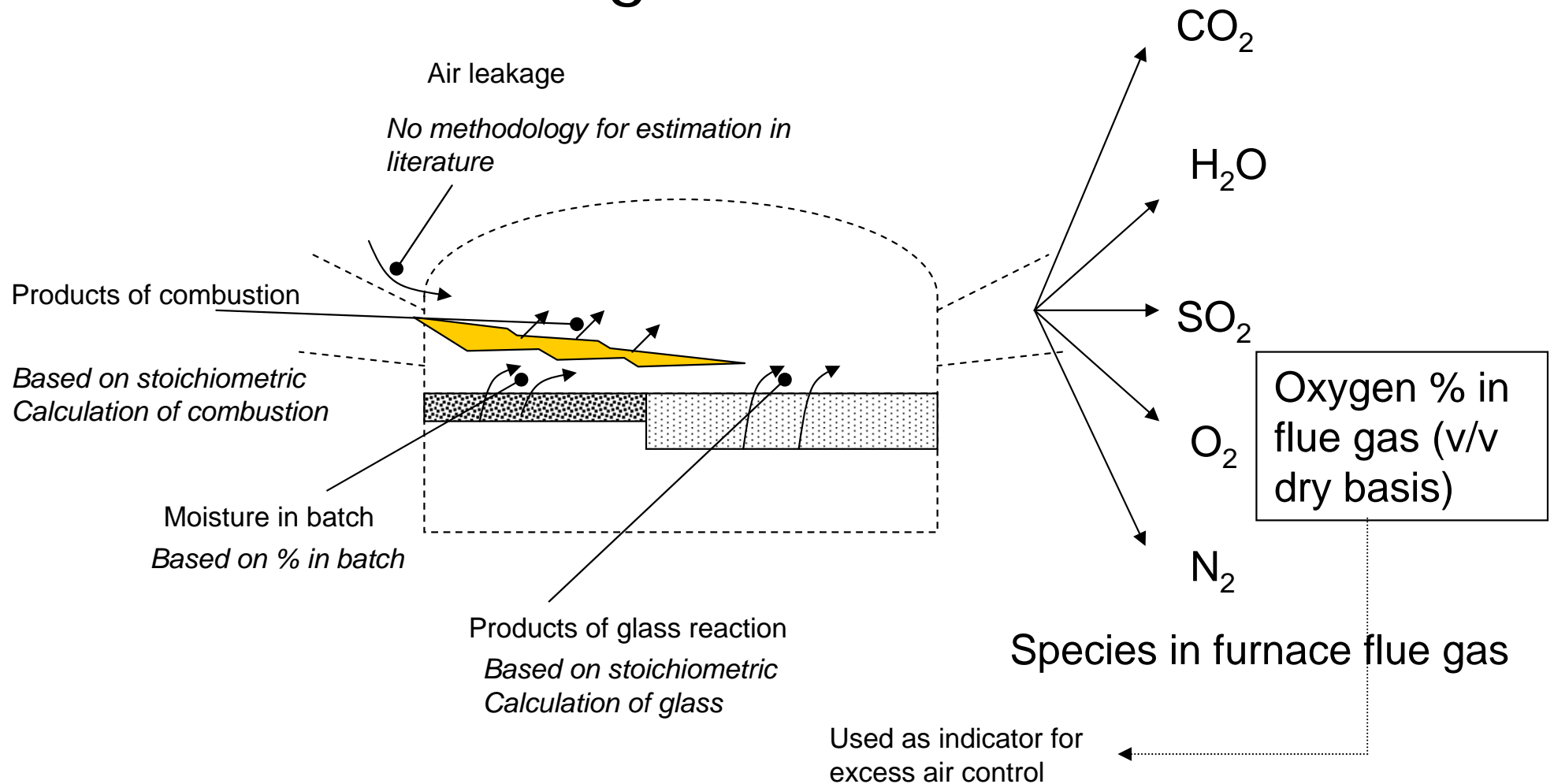
- Batch material
  - Cullet (recycled glass)
  - Raw material
  - Moisture
- Fuel
- Combustion air (from regenerator)
- Air leakage (Any air other than inlet from regenerator)

## ■ Output streams

- Molten glass
  - Cullet
  - Glass from raw material
- Flue gas to regenerator
  - Combustion products
  - Glass reaction products
  - Water vapors
  - Air (Not reacted in combustion)
- Flue gas leakage from furnace

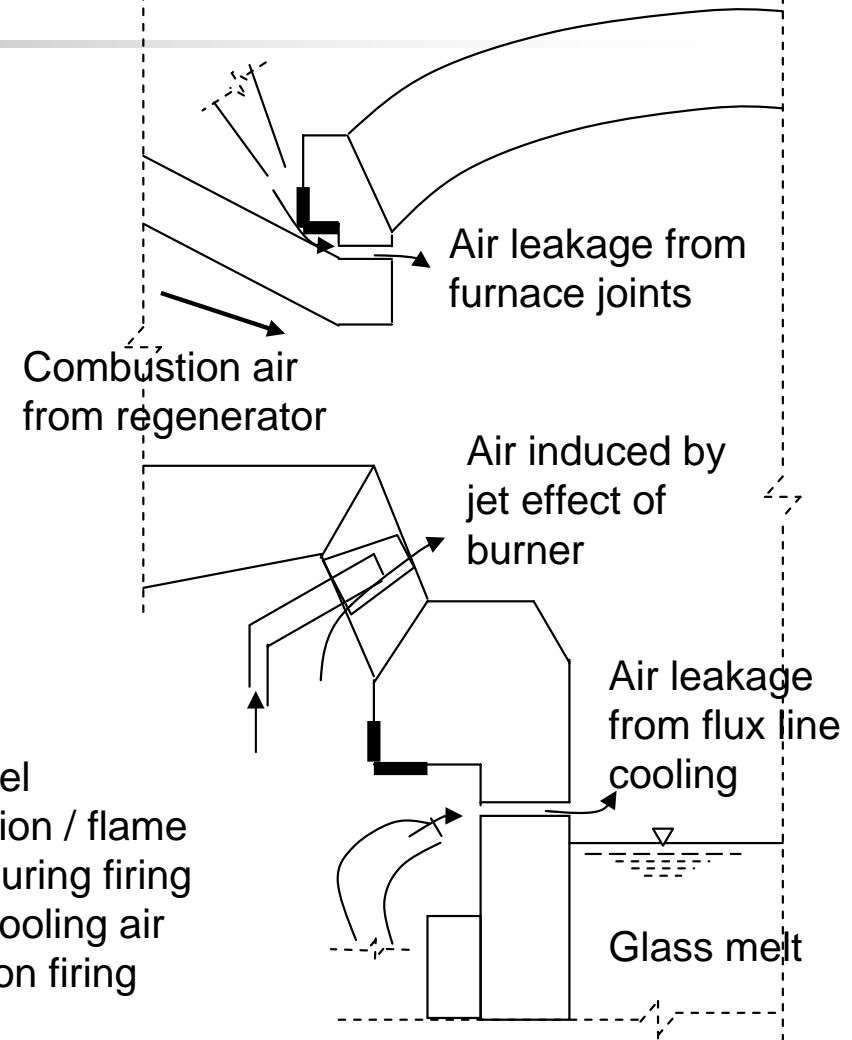
# Mass balance estimation

## Estimation of flue gas formation



# Air leakage estimation

- Furnace operates positive pressure
  - Air leakage in local negative pressure area
  - Air leakage due to higher pressure on air side
  - Air supplied for atomization and flame length control





# Energy balance for furnace

---

- Input streams

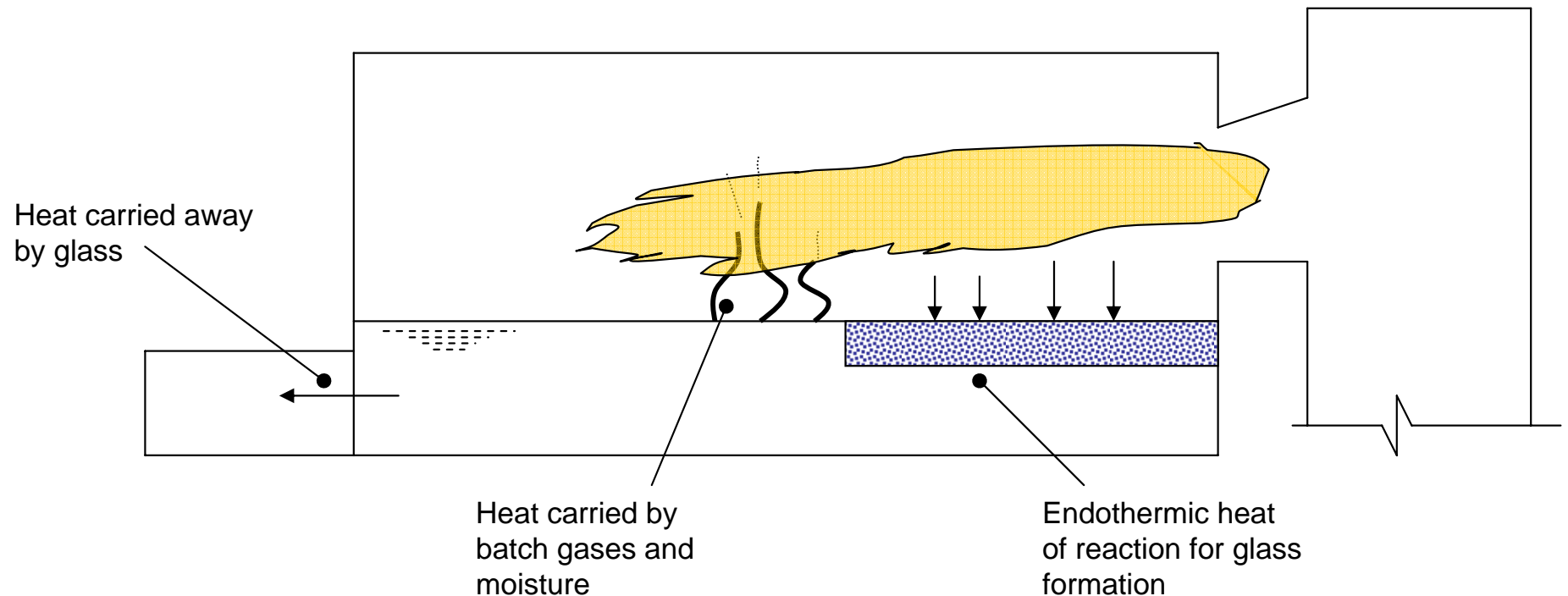
- Energy from fuel
- Energy from preheated combustion air
- Energy from batch material
- Energy from air leakage

- Output streams

- Energy carried in glass
  - Heat of reaction
  - Sensible heat of glass
- Energy carried in flue gas
  - Energy for air leakage
  - Energy for batch gases
  - Energy for moisture
  - Energy for combustion air
- Energy loss from walls
  - Surface heat loss from walls
  - Radiation losses (due to opening)

# Energy balance glass melt

- Heat of reaction for glass
- Heat carried by glass
- Heat carried by batch gas



# Furnace wall losses

Zones along furnace crown and superstructure side wall length

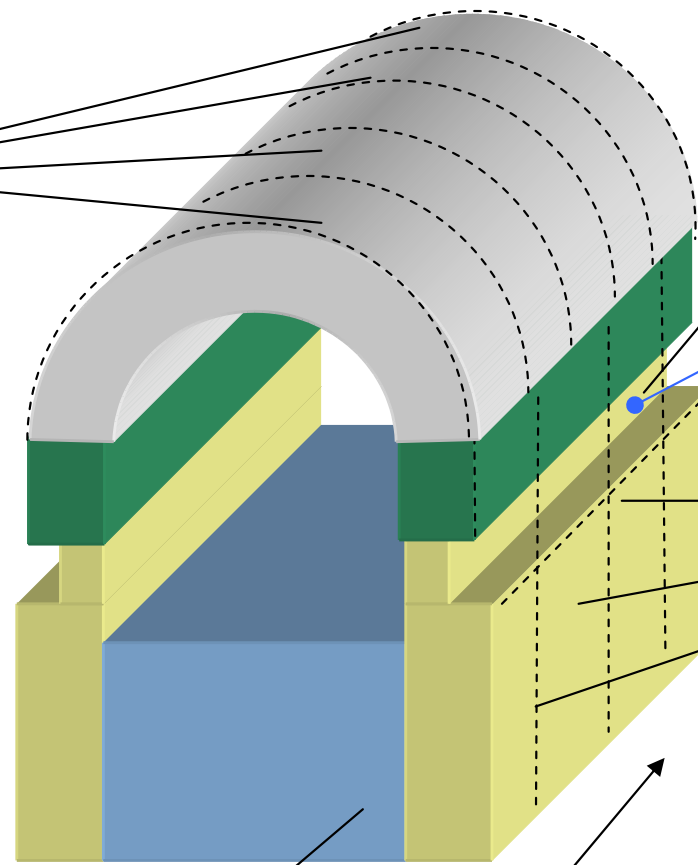
Flux line

Zones along furnace sidewall depth

Zones along furnace melter sidewall length

Glass flow direction

Molten Glass





# Furnace model input parameters

---

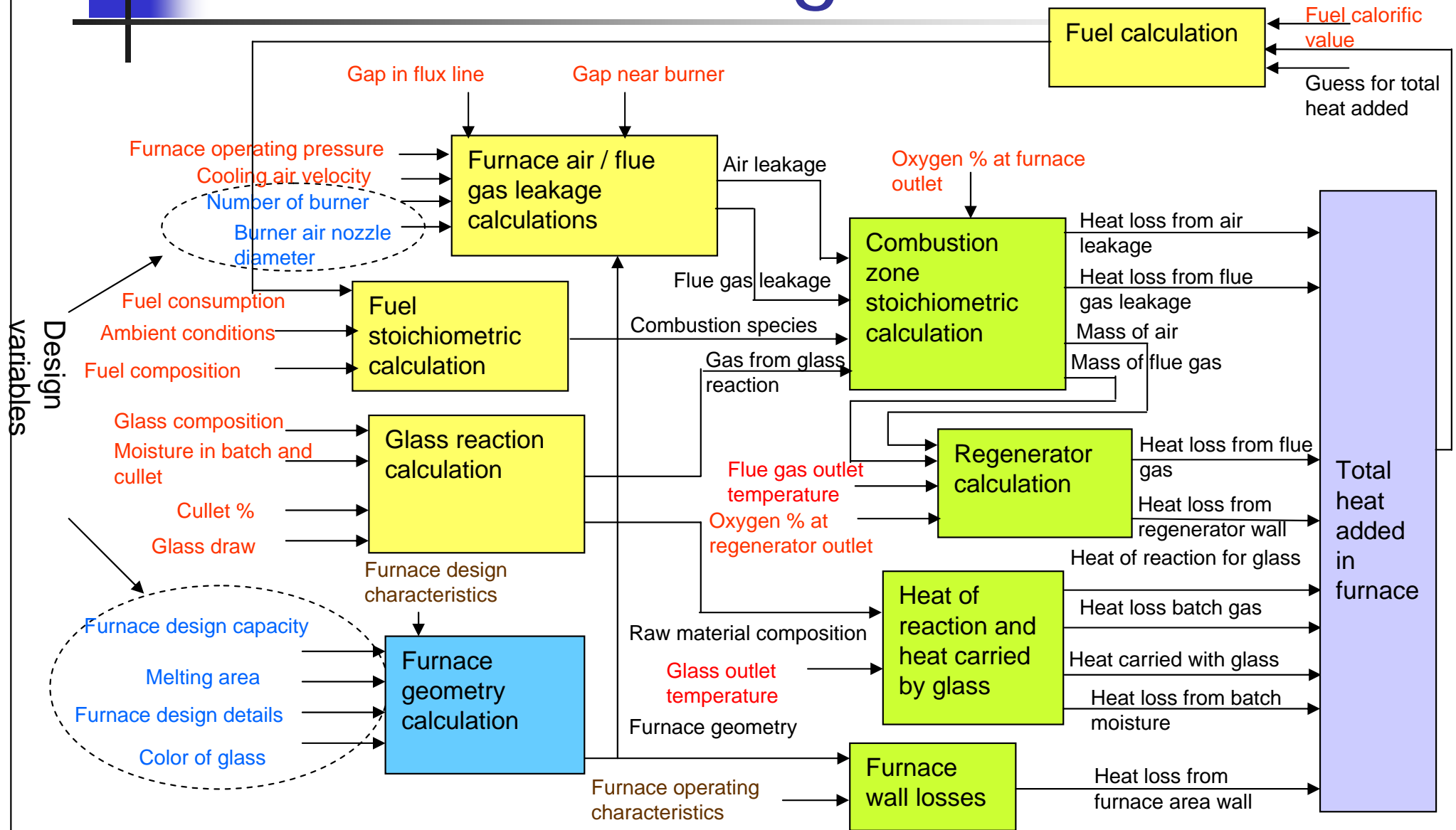
- Design parameter

- Design capacity of furnace
- Melting area
- Length to width ratio
- Height of combustion volume
- Refractory and insulation details

- Operating parameters

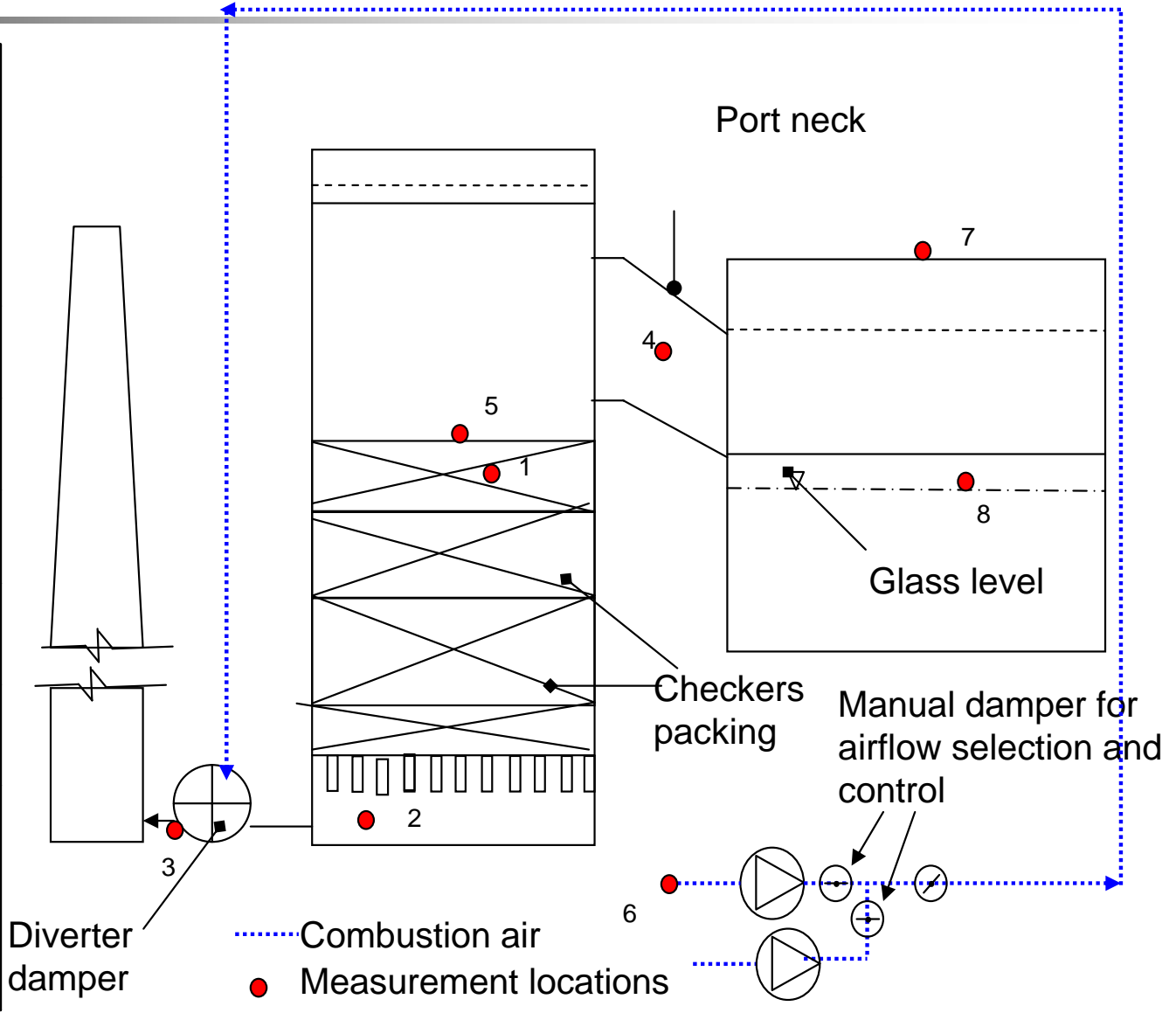
- Furnace draw
- Type of fuel
- Batch to cullet ratio
- Moisture in batch
- Furnace pressure
- Oxygen at furnace outlet
- Atomization pressure
- Reversal time
- Flux-line and burner tip cooling air pressure

# Model flow diagram

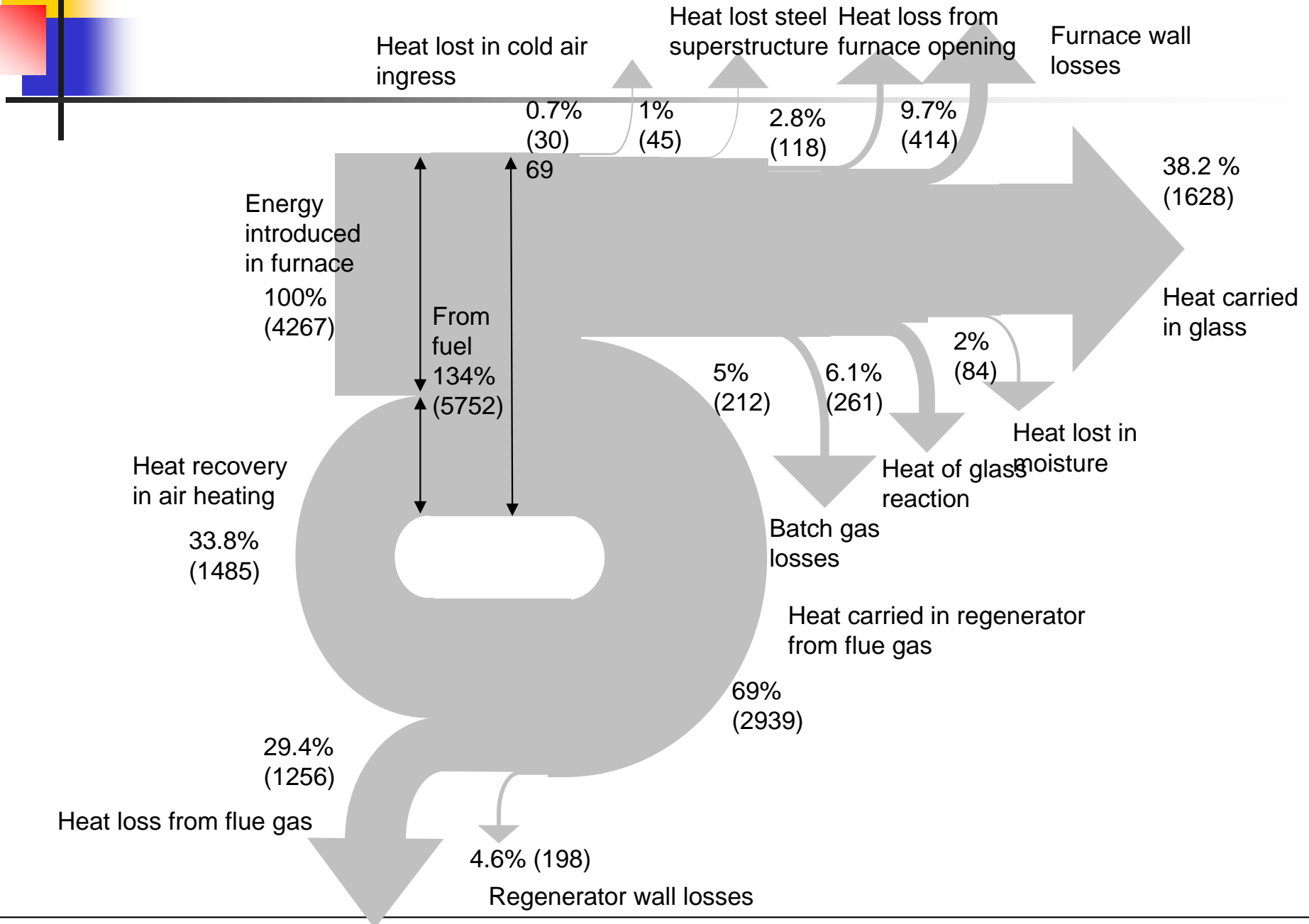


# Furnace measurement

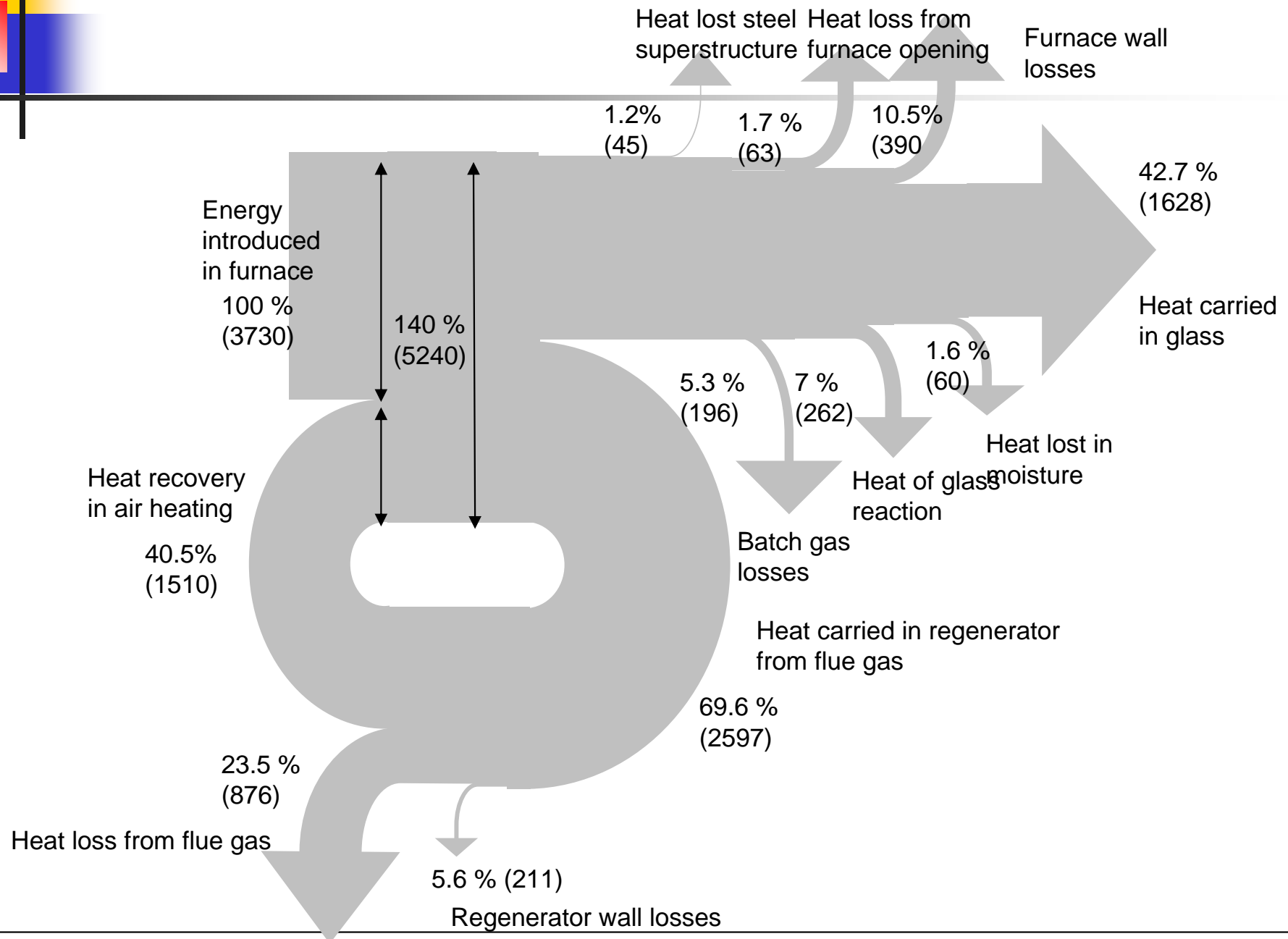
Measurement location	Type of measurement
1	Oxygen % , Pyrometer checkers surface temperature
2	Oxygen % , Flue gas temperature
3	Oxygen % , Flue gas temperature
4	Oxygen % , Skin temperature
5	Pyrometer checkers surface temperature
6	Velocity of air at the suction of blower
7	Outside wall temperature for crown and side wall
8	Pyrometer glass surface temperature



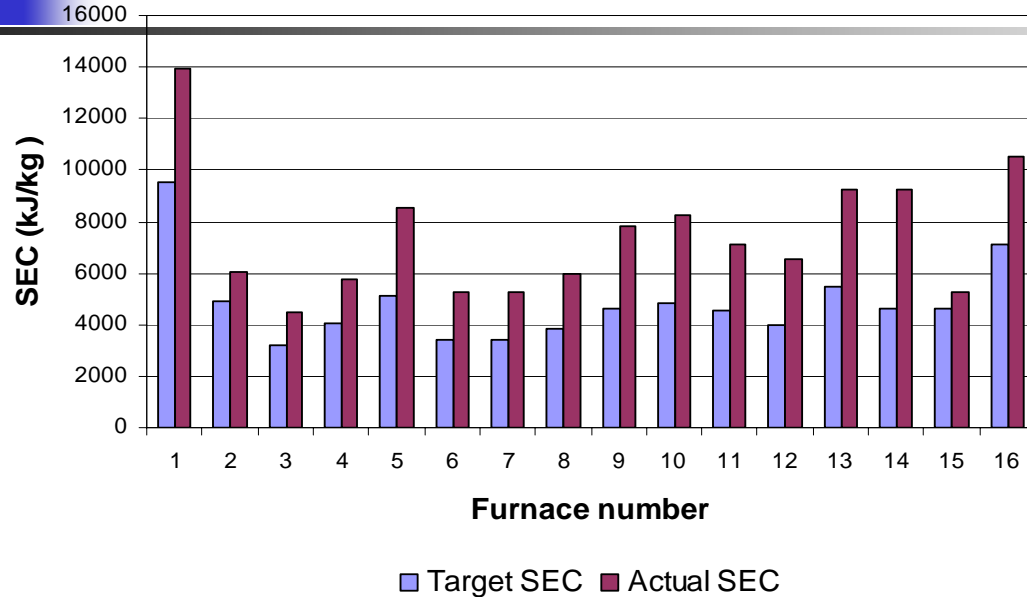
# Model results: Actual SEC



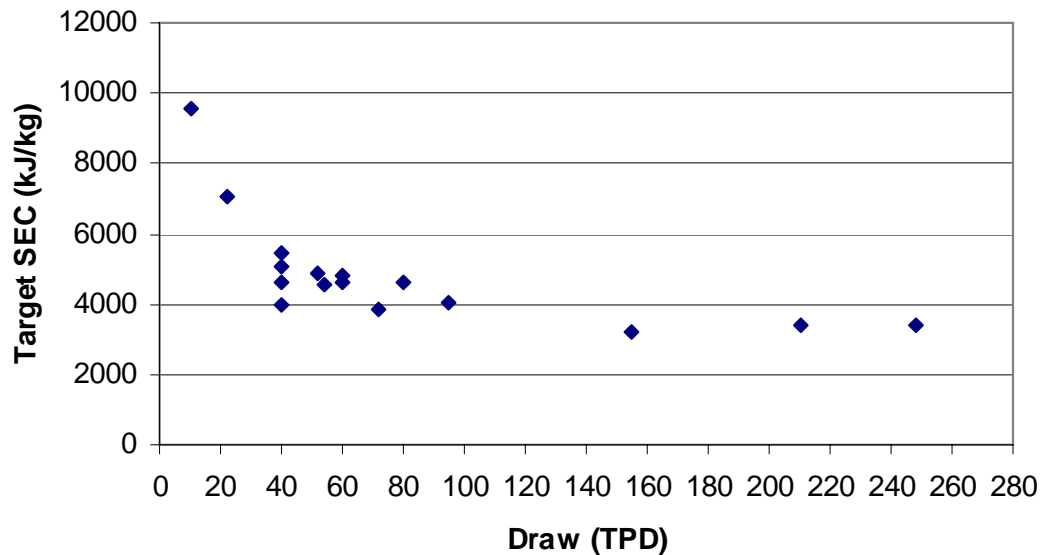
# Model results: Target SEC



# Conclusions



- Target SEC estimated for 16 industrial furnaces
- Effect of furnace draw on target SEC is demonstrated







# Energy Planning Research Objective

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- Energy Planning - Aggregated at National Level
- Sectoral Planning - Oil, Electricity
- Limited Efforts in Local Level Energy Planning
- Energy critical input for development
- Need for micro level energy planning

Objective: Develop a tool for improving local level energy decisions



# DSS Modules

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- Energy Models in Literature – aggregate , homogenous unit, optimisation, no linkage with decision structure
- Study of decision structure, proposed an accounting framework
- Disaggregation by sector, end-uses
- DST-UNDP project – Bankura district in West Bengal

Analysis **District level – with block as an unit**  
**Block level- with village as an unit**



# Energy decisions for district officials

District Magistrate	Ratifying departmental decisions
Zilla Parishad Sabadhipati	Sanctioning/selecting schemes
Manager, DIC	Sanctioning industries, biogas plant, Priority list of industries.
DE, WBSEB/Addnl CE (Rural Elec)	Mouza electrification
Controller food, civil supplies	Distribution of kerosene, coal.
Lead Bank Officer	Preparation of District credit plan
District forest Officer (DFO, working plan)	Managing forest area
District Planning Officer	Prepares district plan

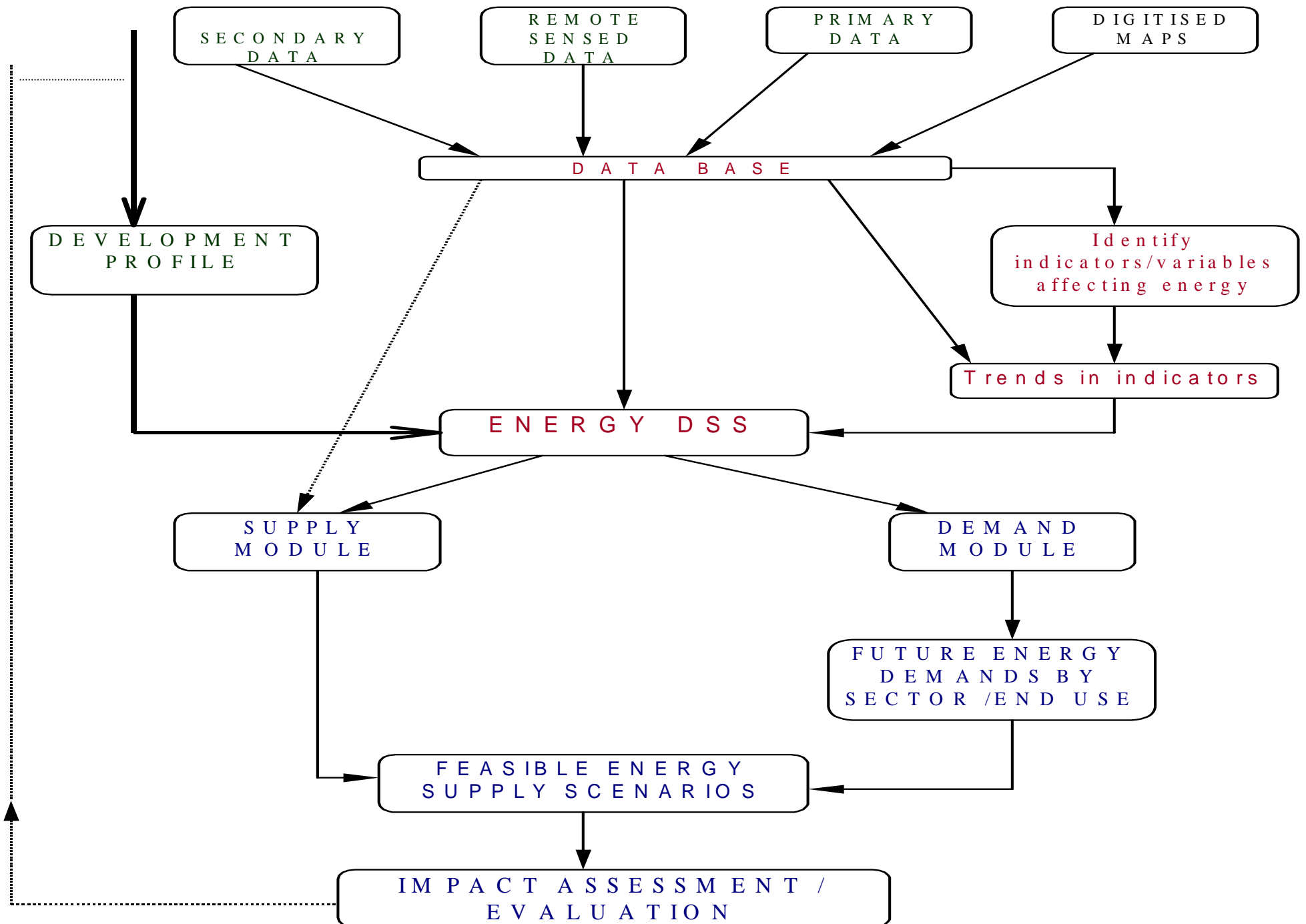


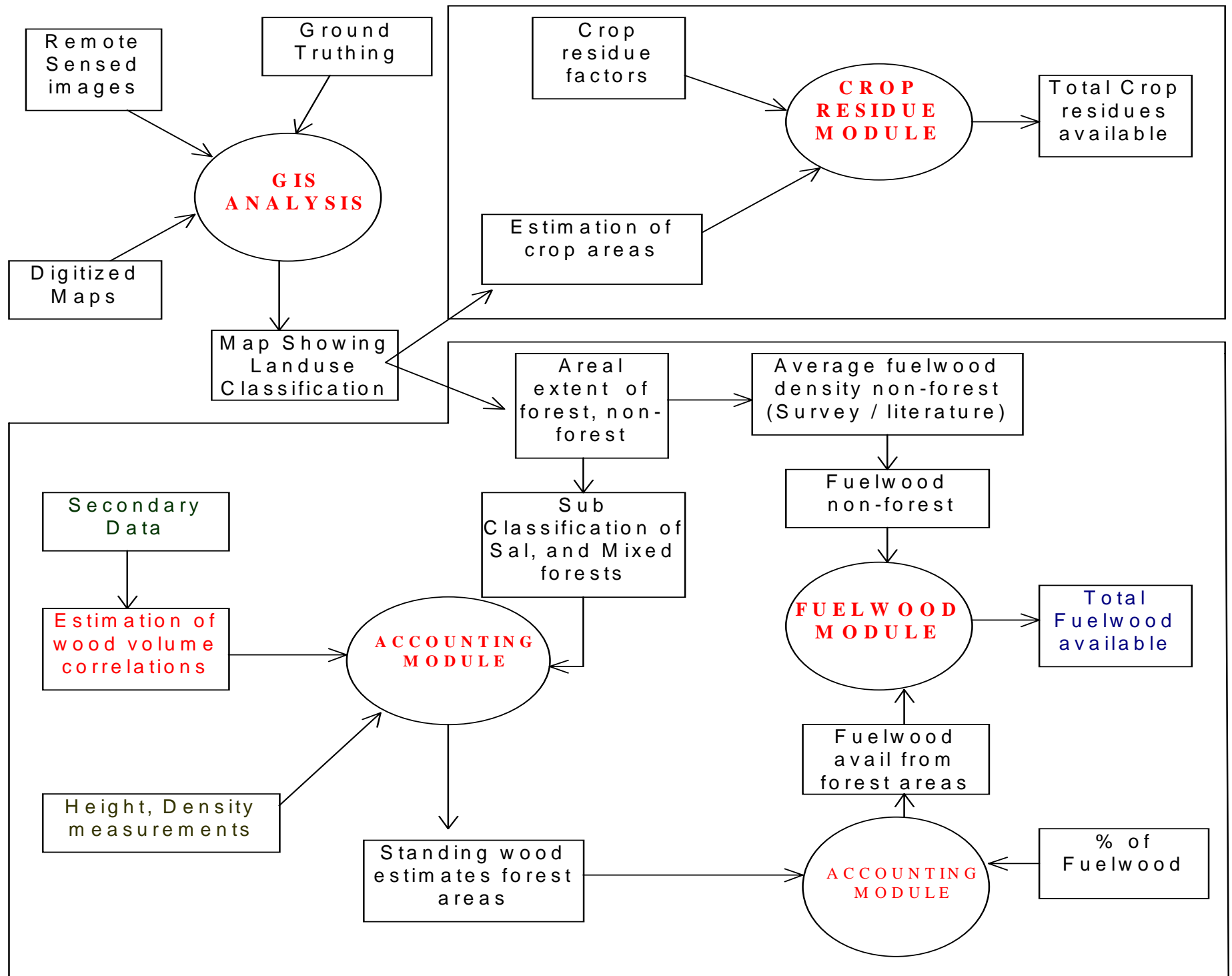
# Typical Energy Decisions

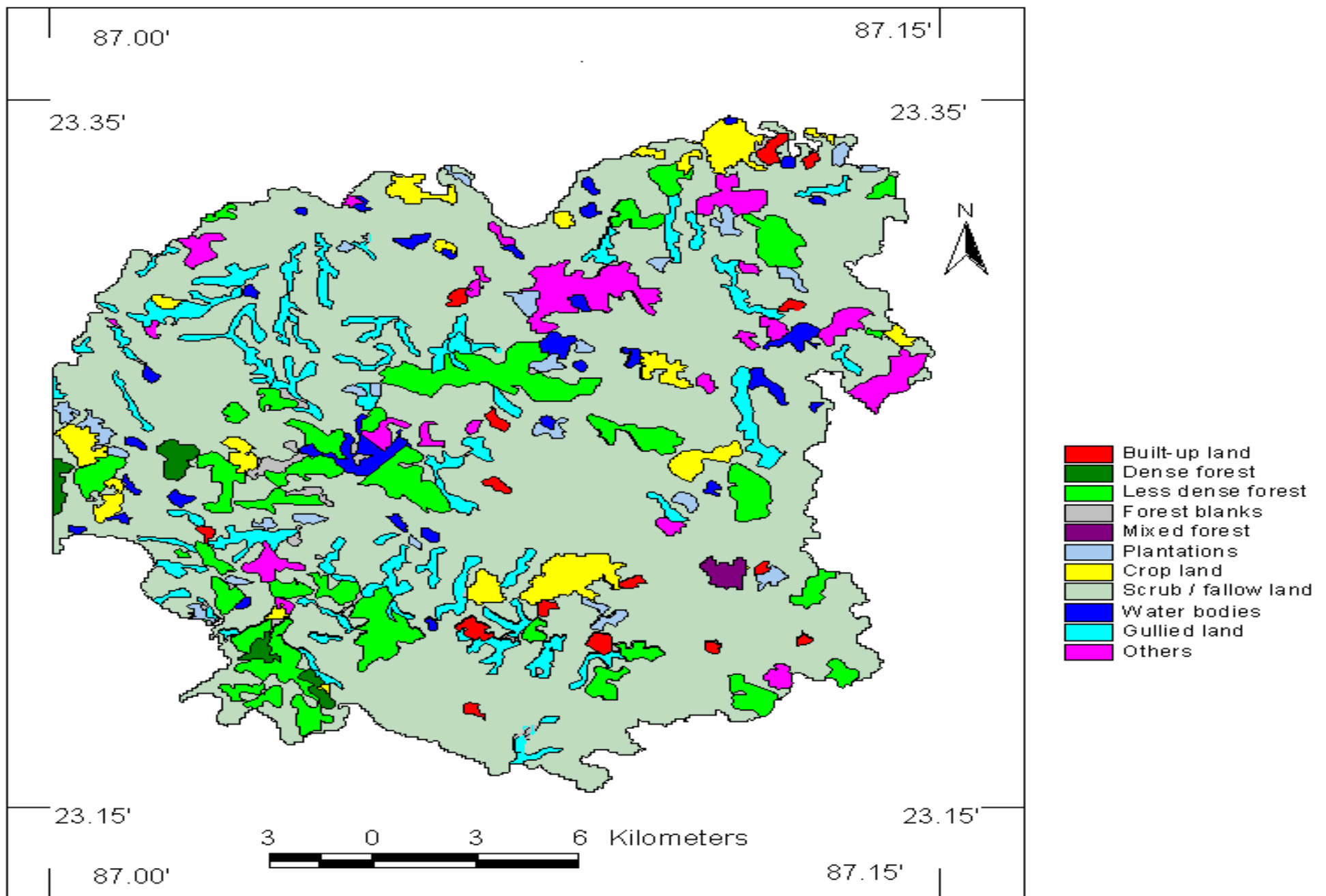
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- **District** – Fund Allocation to blocks, Mouza electrification, Industrial devpt., Coal – elect., fuel / ration shops Sanctions.
- **Block**– Fund Allocation to GPs, Kerosene allocation, industry promotion, marketing support.
- **Gram Panchayat** – Agriculture / irrigation schemes, Co-op industry, request for fuel/ration shop, electricity.
- **Household** – Fuel choice, Device choice.

# DSS Frame Work







Source: IRS-1B LISS-II Satellite data(28.Feb.96)

**Landuse / landcover map of Gangajalghati block, Bankura district**



# Drivers for Demand Scenarios

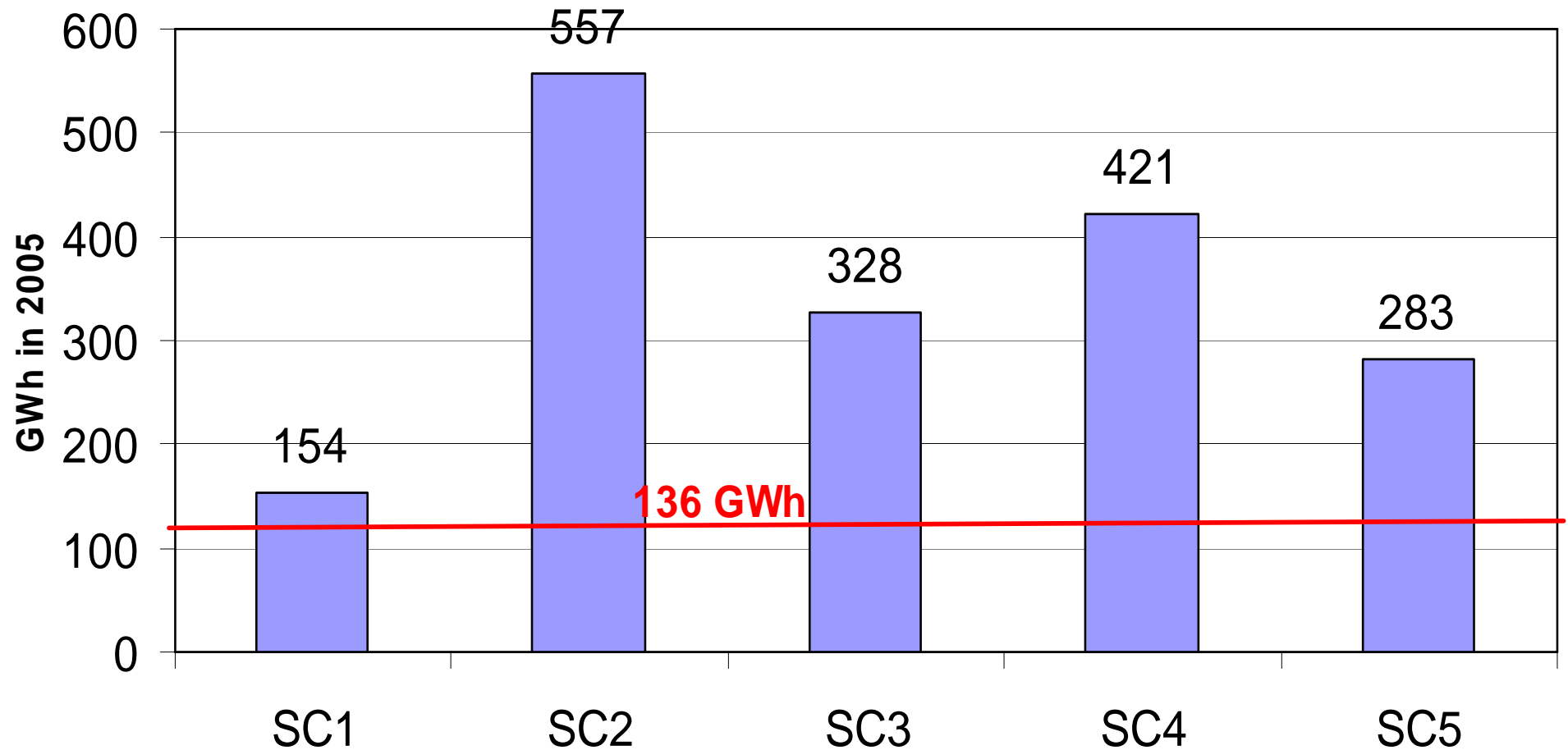
	Residential cooking	Residential Non-cooking	Agriculture	Industrial
<b>Drivers</b>	Population Low-Med-High (L-M-H)  Income No Transition(NT)/ Transition(T)	Population (no of Households) Low-Med- High (L-M-H) Income NT-T Electrification NE-ME-AE	Rainfall Low-Med-High LR – MR – HR Irrigation NI – LI- MI – HI Crop Pattern NTC/TC1/TC2 Pump Electric NE/ME/AE	Growth Low-Med-High LG/MG/HG *Rice mills linked to agricultural scenarios
<b>No of combinations</b>	<b>6</b>	<b>18</b>	<b>108</b>	<b>3+</b>



# Select Scenario cases

	Population	Income	Village Electrification	Rain	Irrigation Land	Crop Pattern	Pump Electrified	Ind. Growth
SC1	L	NT	NE	HR	NI	NTC	NE	LG
SC2	H	T	AE	LR	HI	TC2	AE	HG
SC3	M	T	ME	MR	MI	TC2	ME	MG
SC4	L	T	AE	HR	HI	TC1 TC2	AE	HG
SC5	L	T	ME	HR	MI	TC1	ME	MG

# Electricity Demand in 2005



Demographics  
1. Number of Households (HH)  
2. % of HH in each income class

Technology Characteristics  
1. Rating (kW)  
2. Efficiency

Usage pattern  
1. Daily variation  
2. Seasonal Variation

Appliance ownership data  
by each income class

Total no of  
Appliances in Area

Electricity consumption in  
Residential sector. (Including  
the load curve) for each  
season/Annual

Number of  
Electric  
Pumpsets

Usage and  
seasonal  
variation

Technical  
specifications

Number of  
Commercial  
shops

Technical  
Characteristics  
and Usage

Agriculture Load

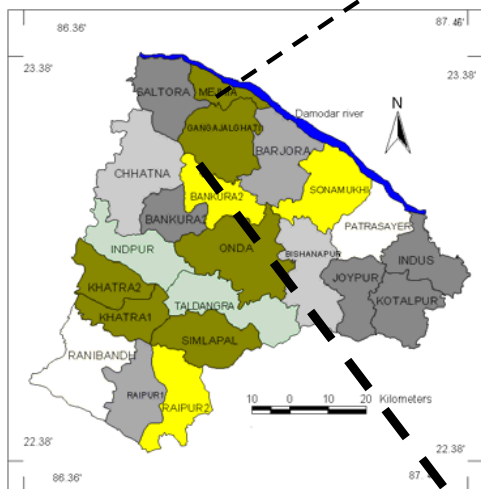
Appliance  
ownership

Total  
Appliances

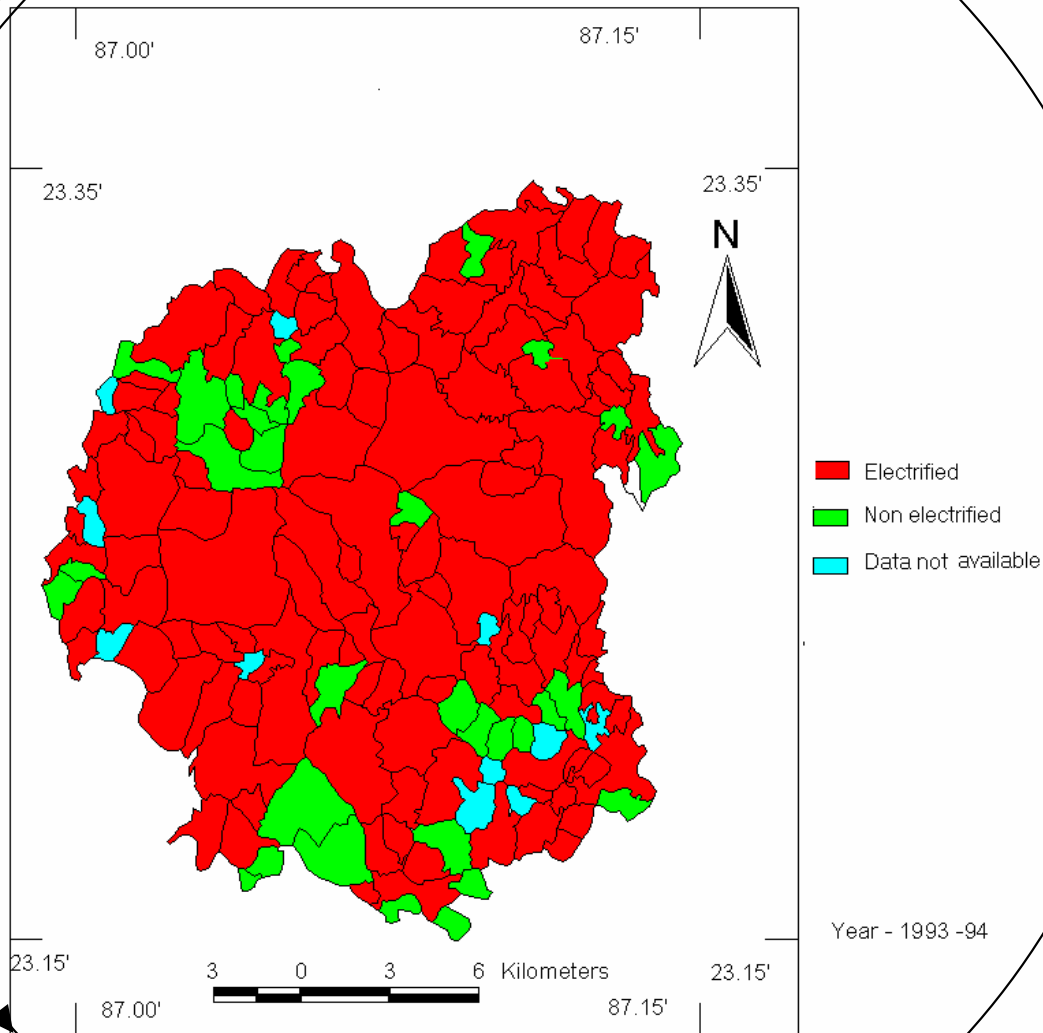
Commercial  
Load

Total Electricity  
demand.  
Daily load  
Curve  
Summer/Winter

# Village Electrification example



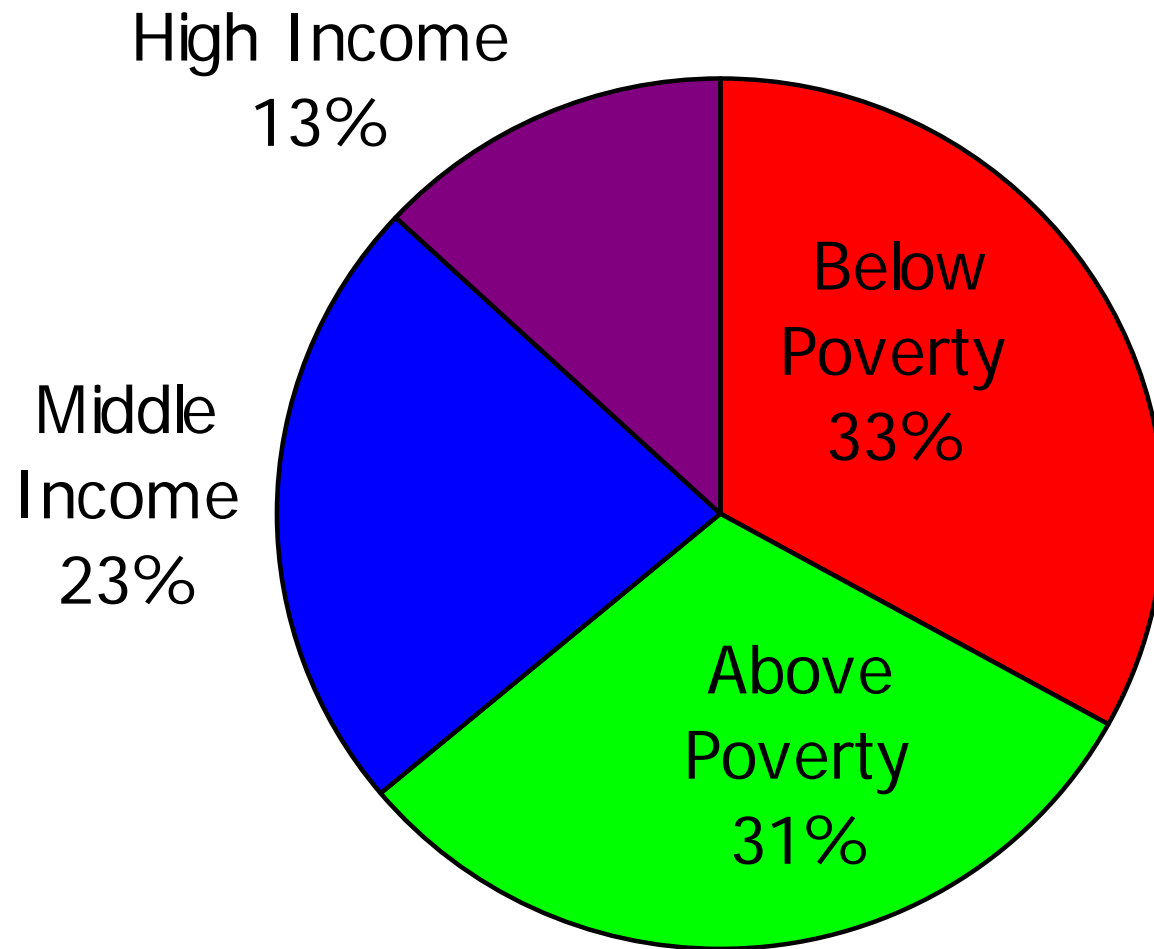
Administrative map of Bankura district, West Bengal.



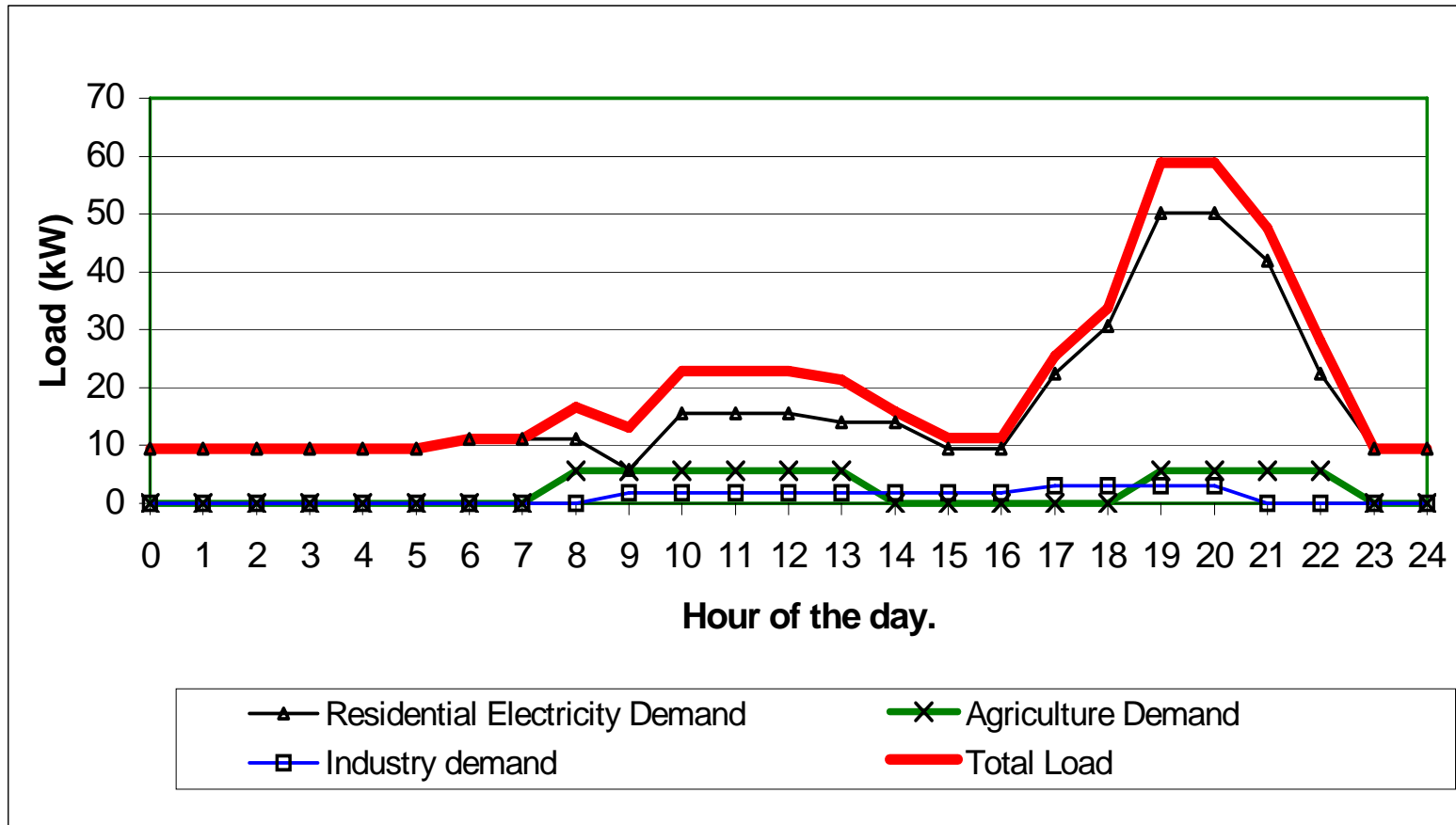
Year - 1993 -94

Source - Village level indicator

Map showing electrified and not electrified villages in Gangajalghati block



**Income class distribution in Rajamele in 1994.**



**Daily load curve for Rajamele village in Summer in 2005**



# DSS Capability/Use

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- Energy Quantification- from data already available/collected by Govt
- Assess impacts of development paths
- Quantify future commercial fuel demands – elec/coal/LPG/kerosene
- Rural Electrification- Load Profile Estimation, Sizing, Option Selection, Impact Assessment
- Spatial Representation of results
- Classification of areas as biomass surplus/deficit



# Summing Up

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- Examples – illustrate variety of optimisation/ simulation models for energy sector
- Decision context and model formulation critical
- Reality check - Applicability
- Generalisation important but..
- Data intensity and uncertainty

# Acknowledgment



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**(2004-2006)**



Balkrishna Surve  
Project Assistant



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Manojkumar M.V.  
M.Tech - Ongoing

# Thank you



# References

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- George, R. Banerjee,Analysis of impacts of wind integration in the Tamil Nadu grid, in press, Energy Policy
- UK Wind speed data: GWEFR Cyf Hourly-mean wind speed datasets for sites in the European Wind Atlas, available at <http://www.gwefr.co.uk/datasets.htm>
- UK load curves: Demand Data, UK National Grid, available at <http://www.nationalgrid.com/uk/Electricity/Data/>