



# Open Source Modelling and Optimisation of Energy Infrastructure at Urban Scale

Final presentation

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# Outline

- 1 Energy, Infrastructure, City
- 2 Mathematical modelling, optimisation, case study
- 3 Sustainable model use

# Section 1

## Energy, Infrastructure, City

## Questions about Germany's Climate Action Plan 2050

(BMUB 2015/16)

1. How can the almost complete transition from fossil fuels to renewable energy sources for electricity generation be accomplished by 2050?

<http://www.klimaschutzplan2050.de/en/action-areas/energy-sector/>

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4. Which role do decentralised energy supply concepts play?
5. How can the electricity and heating/cooling markets be more closely integrated [...]?

<http://www.klimaschutzplan2050.de/en/action-areas/energy-sector/>



## Physics

Theoretical  
feasibility  
(Natural laws)

## Engineering

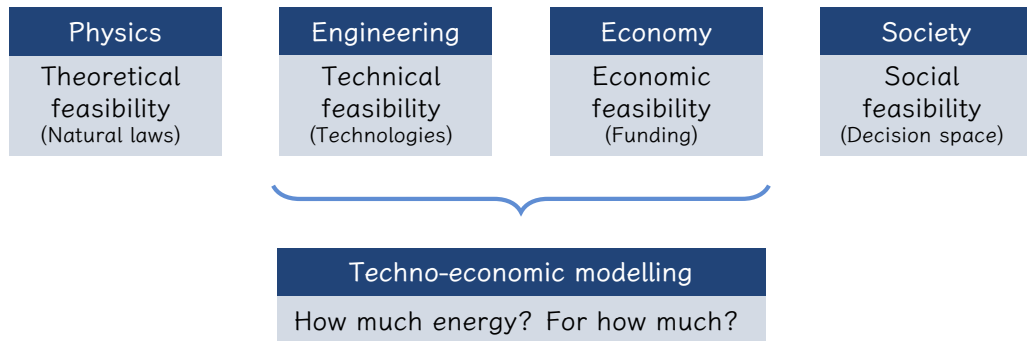
Technical  
feasibility  
(Technologies)

## Economy

Economic  
feasibility  
(Funding)

## Society

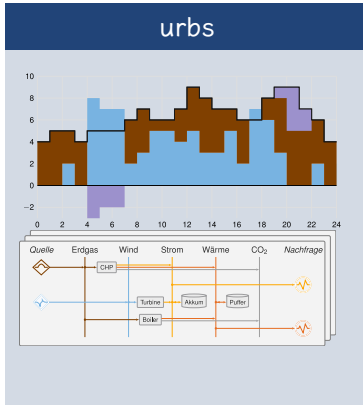
Social  
feasibility  
(Decision space)



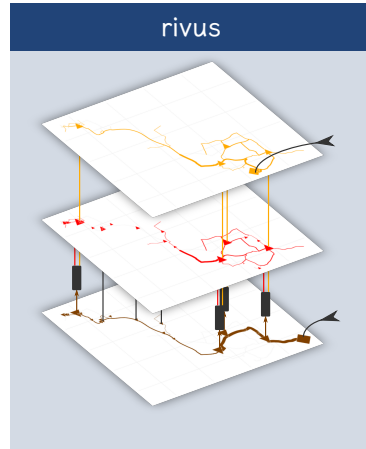
## Section 2

### Mathematical modelling, optimisation, case study

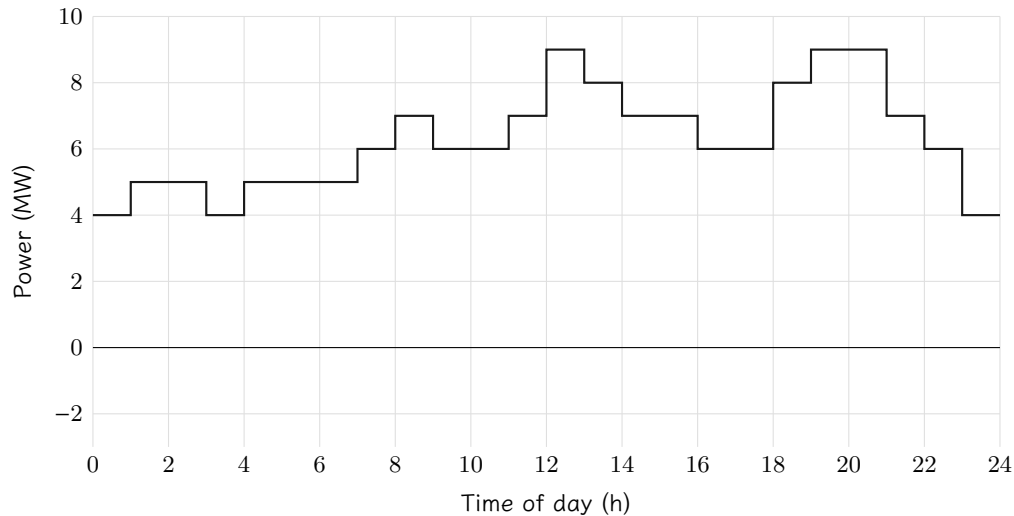
# Model overview

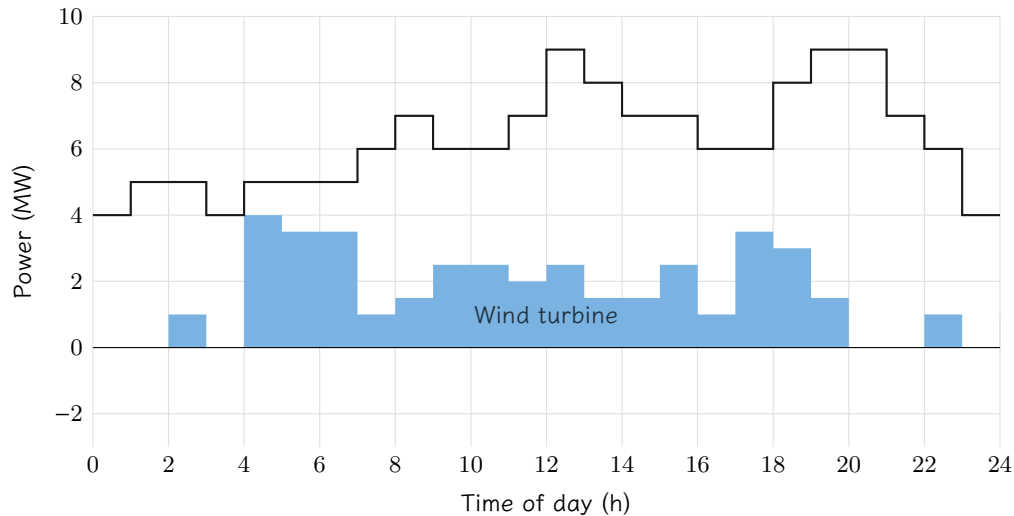


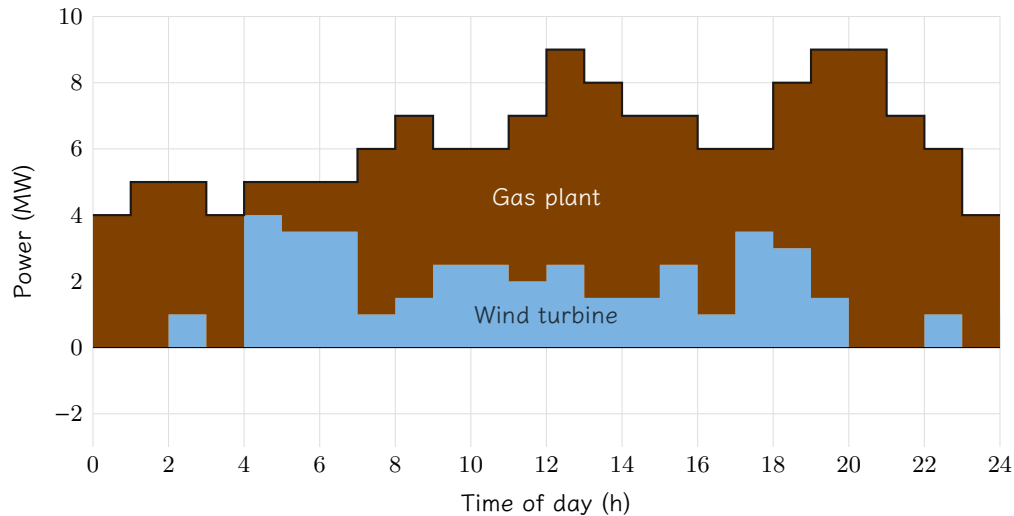
<https://github.com/tum-ens/urbs>

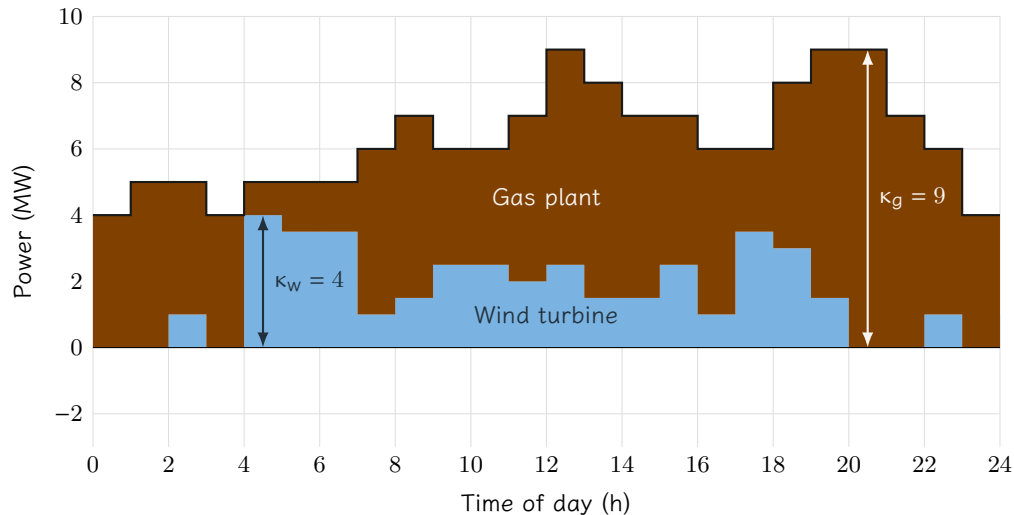


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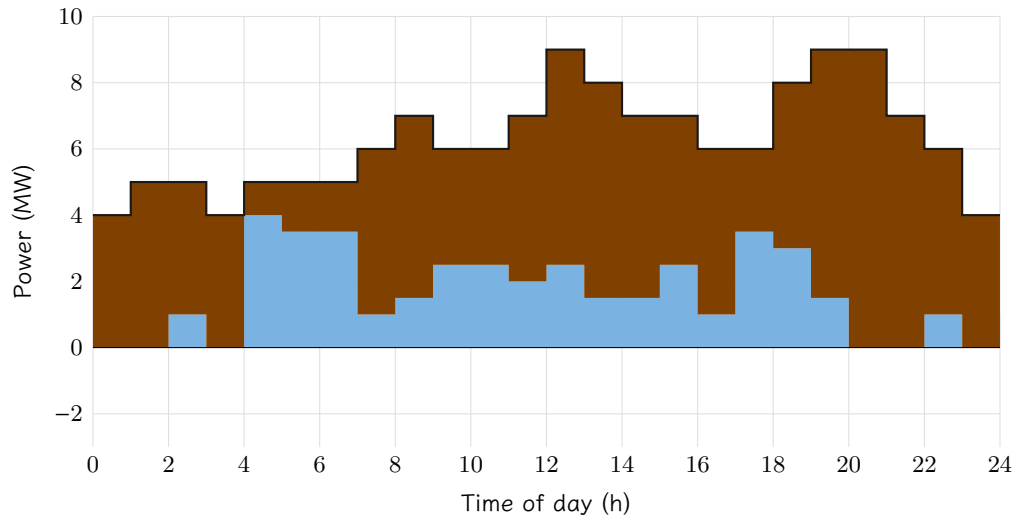


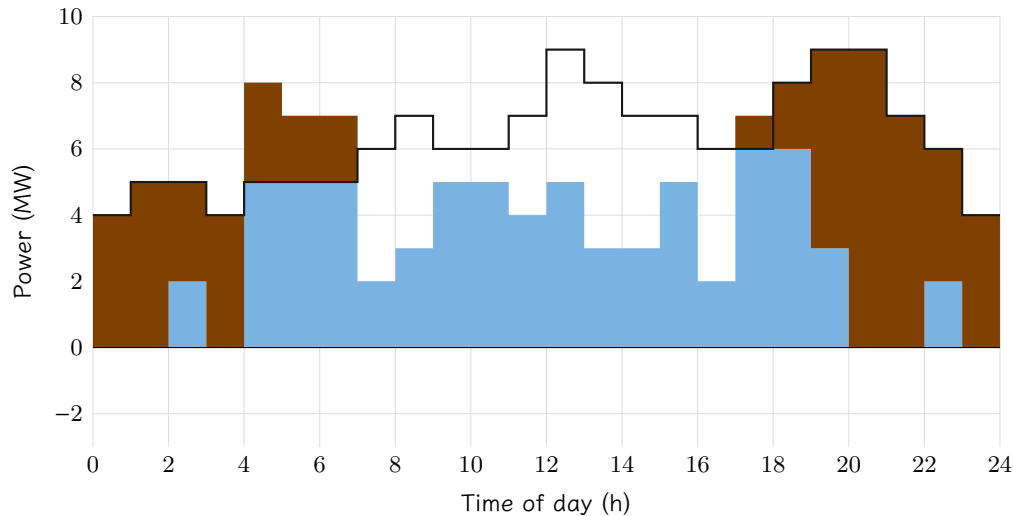


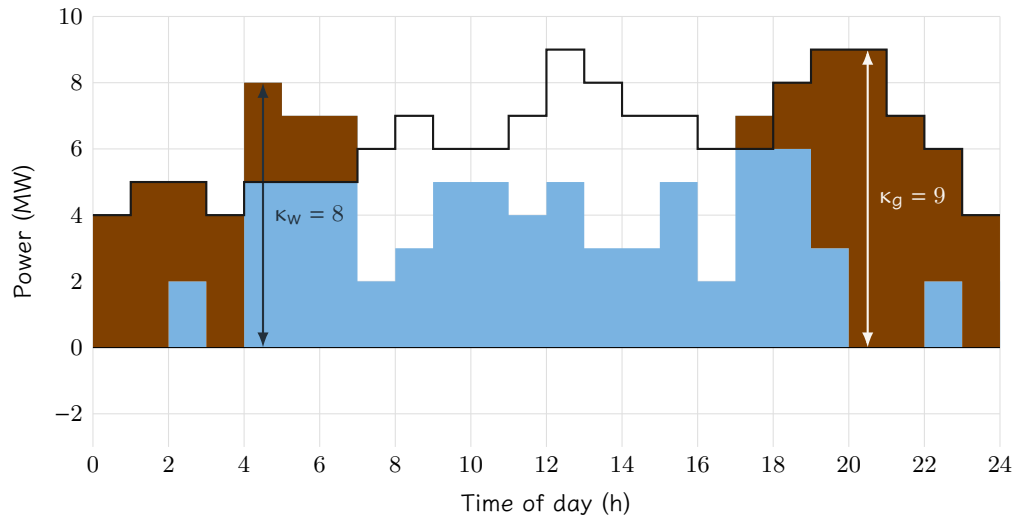


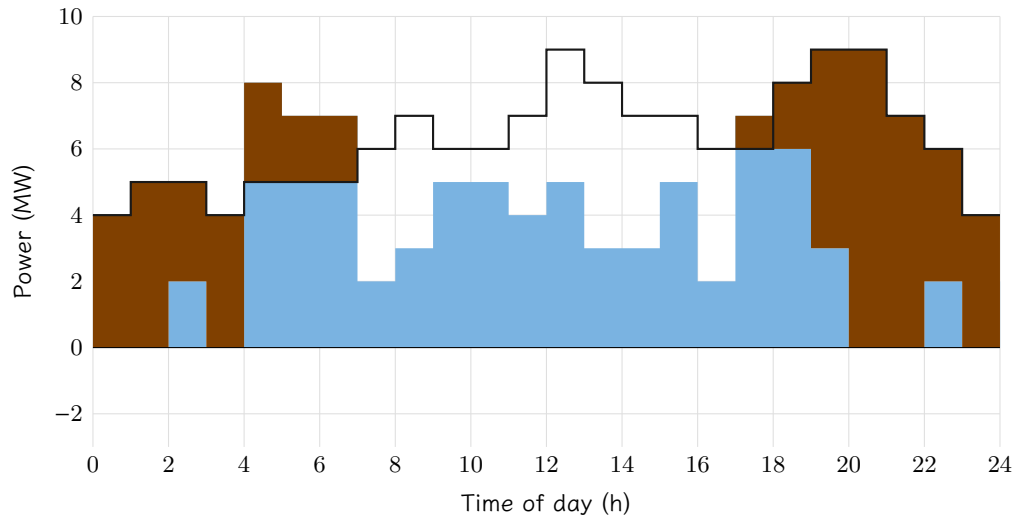


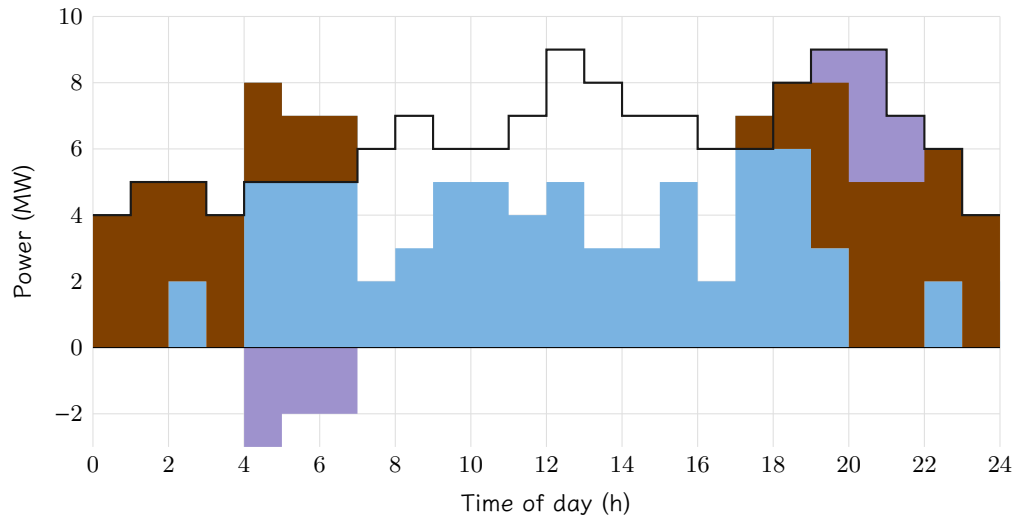


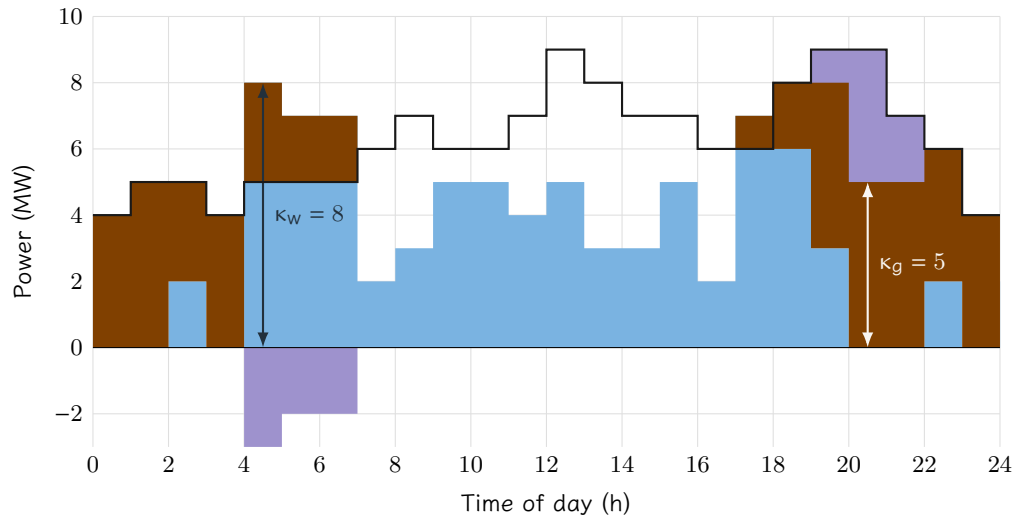


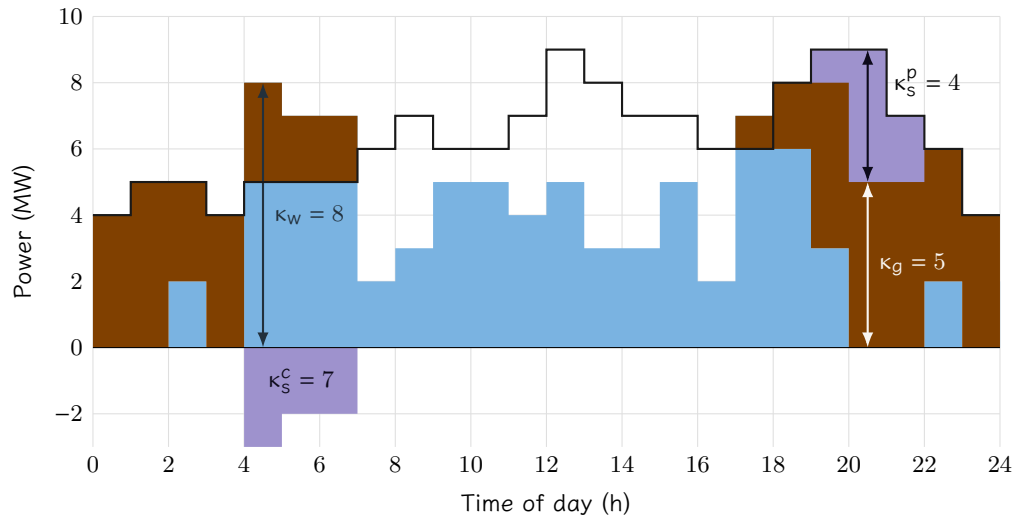












# Notation as mathematical optimisation problem

Sets  $t \in T, p \in P, s \in S, \dots$

Parameters  $d_t$



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Sets  $t \in T, p \in P, s \in S, \dots$

Parameters  $d_t, k_p^{\text{fix}}, k_s^{\text{fix},c}, k_s^{\text{fix},p}$

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Parameters  $d_t, k_p^{\text{fix}}, k_s^{\text{fix},c}, k_s^{\text{fix},p}, k_p^{\text{var}}, k_s^{\text{var}}, \dots$

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Sets  $t \in T, p \in P, s \in S, \dots$

Parameters  $d_t, k_p^{\text{fix}}, k_s^{\text{fix},c}, k_s^{\text{fix},p}, k_p^{\text{var}}, k_s^{\text{var}}, \dots$

Variables  $\kappa_p, \kappa_s^c, \kappa_s^p$

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Variables  $\kappa_p, \kappa_s^c, \kappa_s^p, \epsilon_{pt}, \epsilon_{st}^{\text{in}}, \epsilon_{st}^{\text{out}}, \epsilon_{st}^{\text{con}}, \dots$

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Parameters  $d_t, k_p^{\text{fix}}, k_s^{\text{fix},c}, k_s^{\text{fix},p}, k_p^{\text{var}}, k_s^{\text{var}}, \dots$

Variables  $\kappa_p, \kappa_s^c, \kappa_s^p, \epsilon_{pt}, \epsilon_{st}^{\text{in}}, \epsilon_{st}^{\text{out}}, \epsilon_{st}^{\text{con}}, \dots$

Objective 
$$\min \sum_{p \in P} \left( k_p^{\text{fix}} \kappa_p + \sum_{t \in T} k_p^{\text{var}} \epsilon_{pt} \right) +$$
$$\sum_{s \in S} \left( k_s^{\text{fix},c} \kappa_s^c + k_s^{\text{fix},p} \kappa_s^p + \sum_{t \in T} k_s^{\text{var}} (\epsilon_{st}^{\text{in}} + \epsilon_{st}^{\text{out}}) \right)$$

# Notation as mathematical optimisation problem

Sets	$t \in T, p \in P, s \in S, \dots$
Parameters	$d_t, k_p^{\text{fix}}, k_s^{\text{fix},c}, k_s^{\text{fix},p}, k_p^{\text{var}}, k_s^{\text{var}}, \dots$
Variables	$\kappa_p, \kappa_s^c, \kappa_s^p, \epsilon_{pt}, \epsilon_{st}^{\text{in}}, \epsilon_{st}^{\text{out}}, \epsilon_{st}^{\text{con}}, \dots$
Objective	$\min \sum_{p \in P} \left( k_p^{\text{fix}} \kappa_p + \sum_{t \in T} k_p^{\text{var}} \epsilon_{pt} \right) +$ $\sum_{s \in S} \left( k_s^{\text{fix},c} \kappa_s^c + k_s^{\text{fix},p} \kappa_s^p + \sum_{t \in T} k_s^{\text{var}} (\epsilon_{st}^{\text{in}} + \epsilon_{st}^{\text{out}}) \right)$
Constraints	$\text{s.t. } \forall t \in T: \sum_{p \in P} \epsilon_{pt} + \sum_{s \in S} (\epsilon_{st}^{\text{out}} - \epsilon_{st}^{\text{in}}) = d_t$ $\dots$

# Standard form of linear optimisation problems (LP)

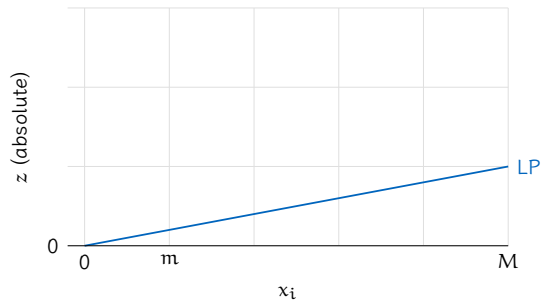
## Generic form

$$\min_{\mathbf{x}} z = \mathbf{c}^T \mathbf{x}$$

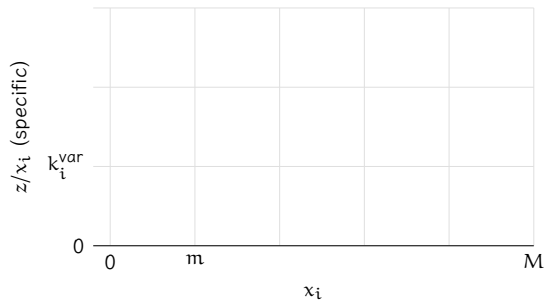
$$\text{s.t. } \mathbf{Ax} \leq \mathbf{b}$$

$$\text{with } \mathbf{x} \in \mathbb{R}^n, \mathbf{A} \in \mathbb{R}^{m \times n}, \\ \mathbf{b} \in \mathbb{R}^m, \mathbf{c} \in \mathbb{R}^n.$$

# Mixed-integer linear programming (MILP)

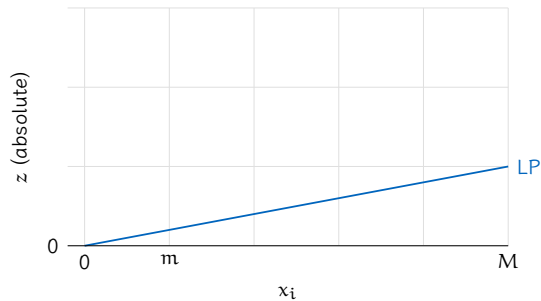


$$\begin{aligned} \text{LP} \quad & z = k_i^{\text{var}} x_i \\ & x_i \leq M \end{aligned}$$

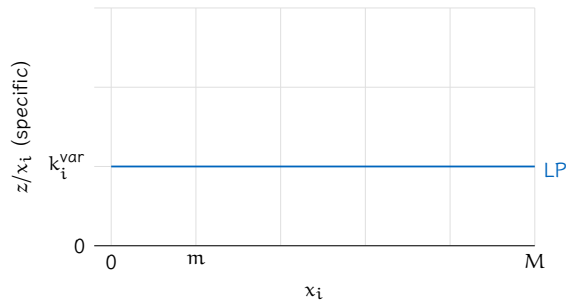




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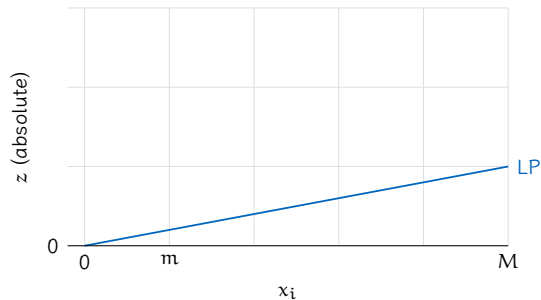


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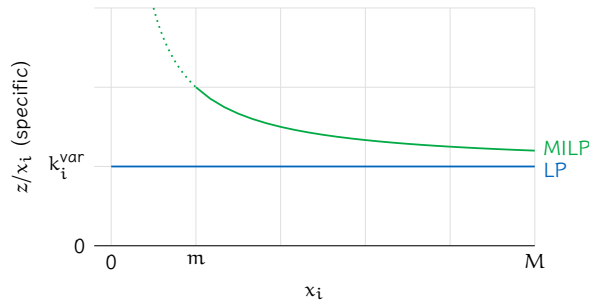


$$\text{LP} \quad \frac{z}{x_i} = k_i^{\text{var}} \equiv \text{const}$$

# Mixed-integer linear programming (MILP)



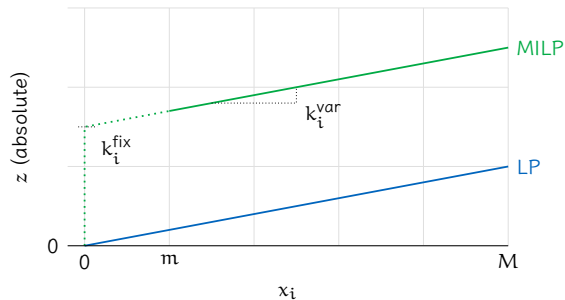
$$\text{LP} \quad z = k_i^{\text{var}} x_i$$
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$$\text{LP} \quad \frac{z}{x_i} = k_i^{\text{var}} \equiv \text{const}$$

$$\text{MILP} \quad \frac{z}{x_i} = k_i^{\text{var}} + \frac{k_i^{\text{fix}}}{x_i}$$

# Mixed-integer linear programming (MILP)



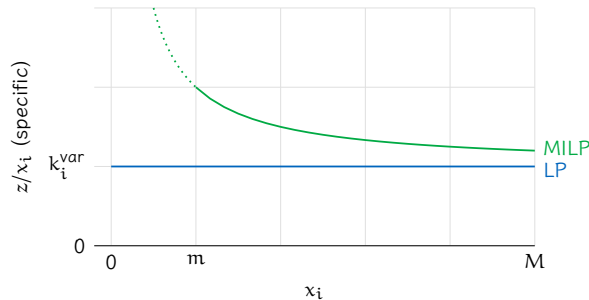
$$\text{LP} \quad z = k_i^{\text{var}} x_i$$

$$x_i \leq M$$

$$\text{MILP} \quad z = k_i^{\text{fix}} y_i + k_i^{\text{var}} x_i$$

$$y_i \in \{0, 1\}$$

$$m y_i \leq x_i \leq M y_i$$



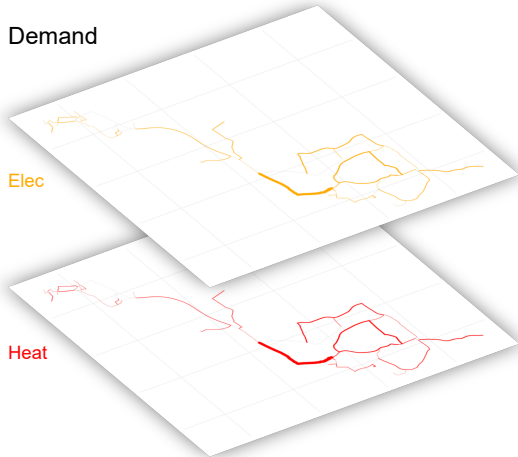
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Demand

Elec

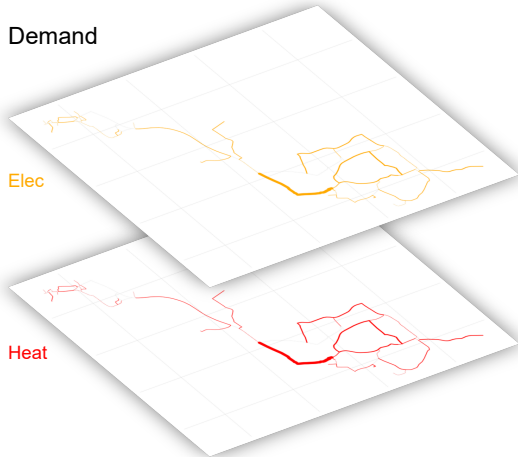
Heat



## Demand

Elec

Heat

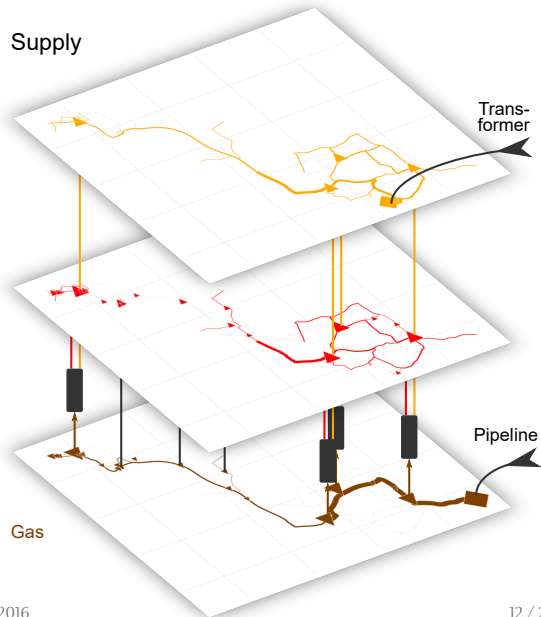


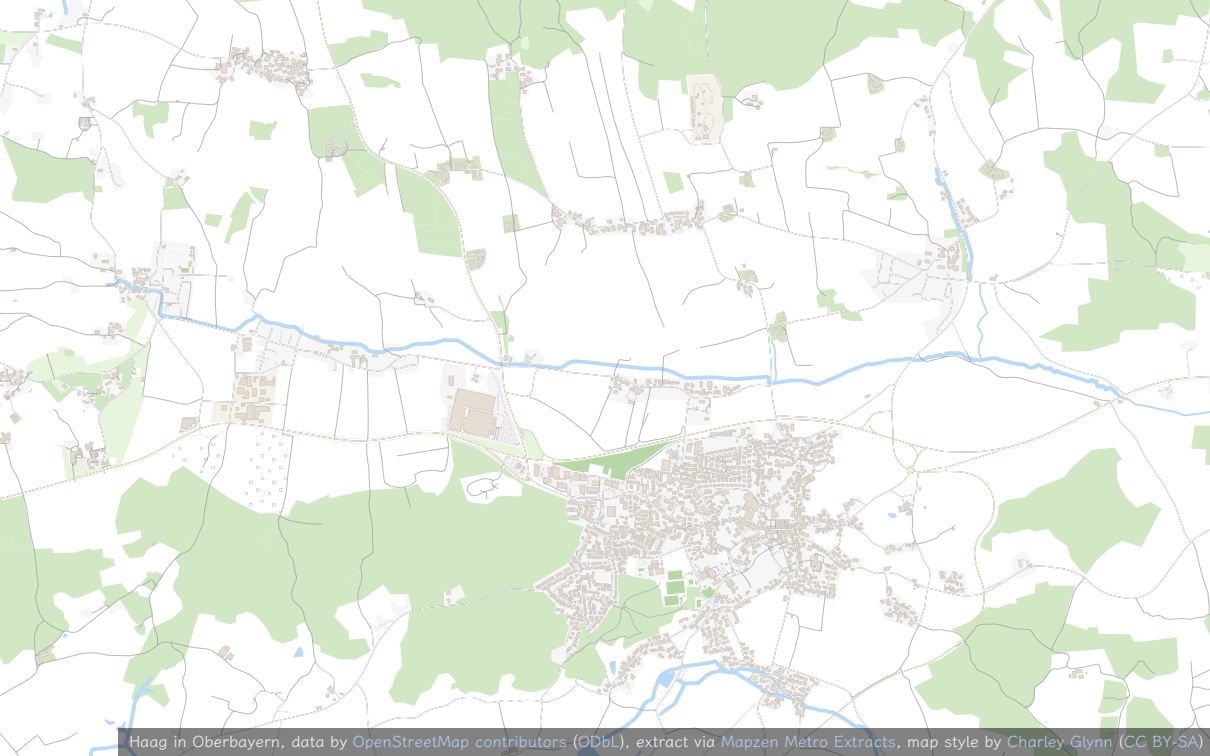
## Supply

Gas

Transformer

Pipeline



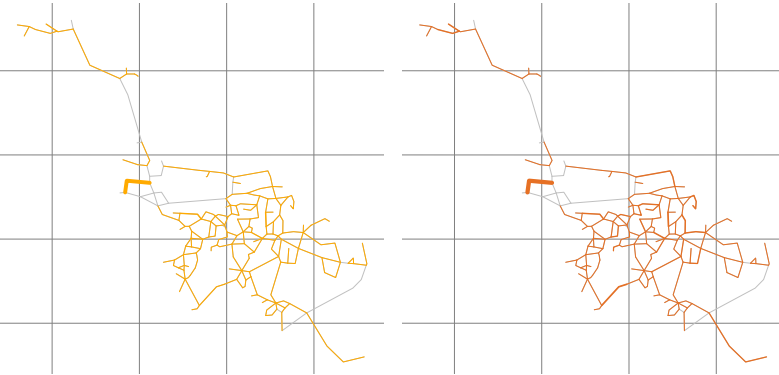


Moosham

# Input data rivus

Electricity

Heat



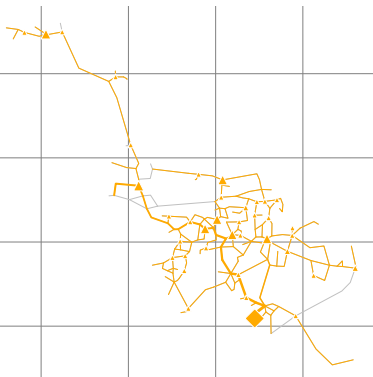
Light industry (Schletter) biggest single consumer

<https://github.com/tum-ens/rivus/data/haag15>

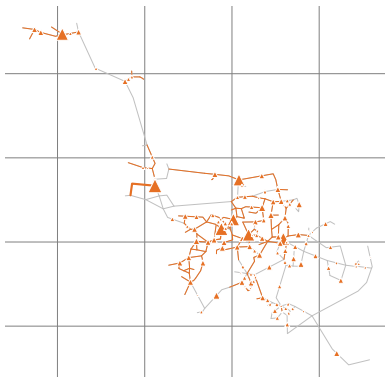


## Result rivus -- Capacities in scenario **base**

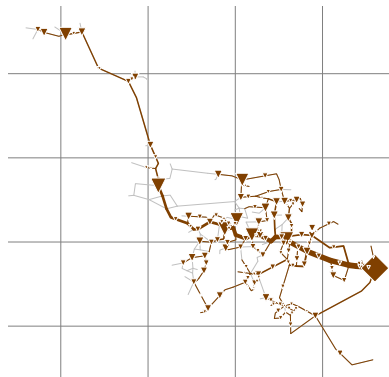
Electricity



Heat



Gas



Full networks for electricity and gas, several local heating networks

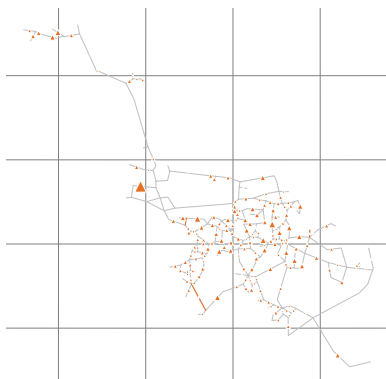
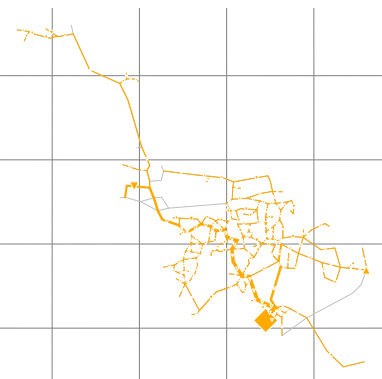
[https://github.com/tum-ens/rivus/runhg15.py:scenario\\_no\\_electric\\_heating\(\)](https://github.com/tum-ens/rivus/runhg15.py:scenario_no_electric_heating())

## Result rivus -- Capacities in scenario future

Electricity

Heat

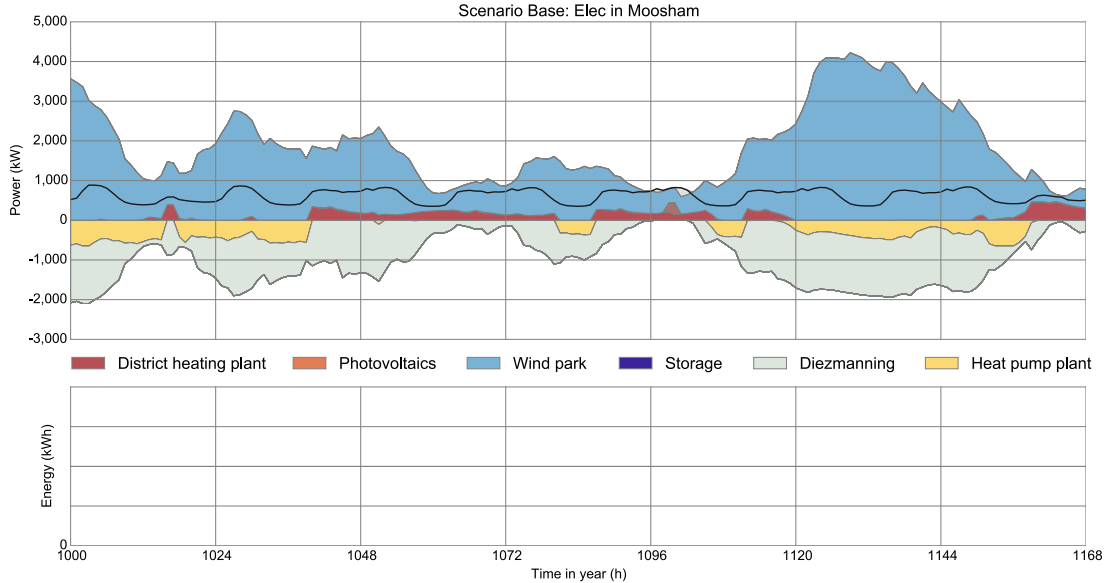
Gas



Strong electricity grid, no gas network, only heat pumps

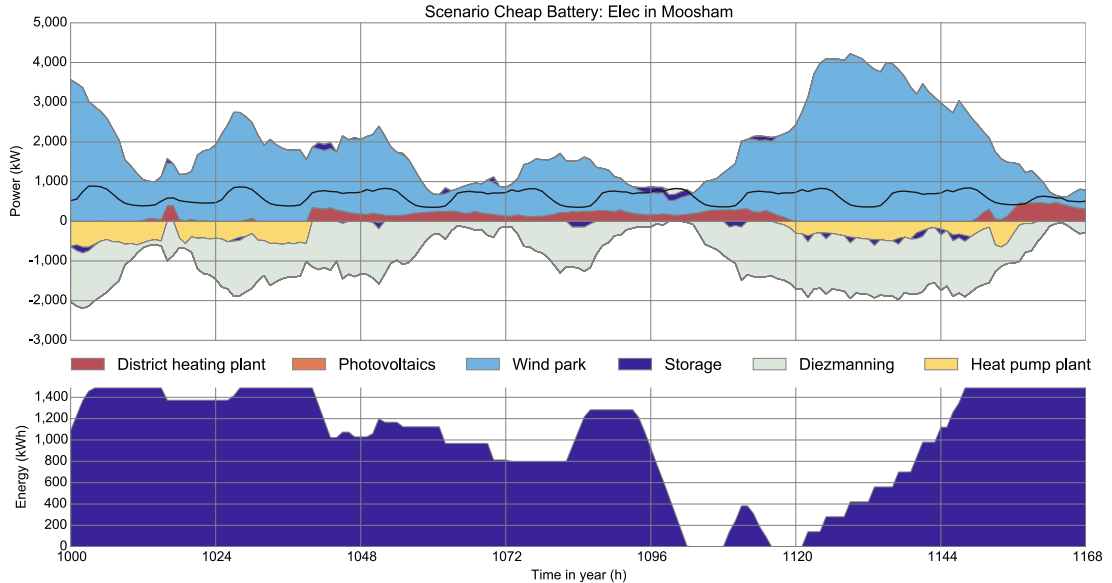
[https://github.com/tum-ens/rivus/runhg15.py:scenario\\_renovation\(\)](https://github.com/tum-ens/rivus/runhg15.py:scenario_renovation())

# Result urbs -- 1 week electricity in scenarios **base**



[https://github.com/ojdo/urbs/tree/haag15/rivhg15.py:scenario\\_base\(\)](https://github.com/ojdo/urbs/tree/haag15/rivhg15.py:scenario_base())

# Result urbs -- 1 week electricity in scenario **cheap battery**



[https://github.com/ojdo/urbs/tree/haag15/rivhg15.py:scenario\\_cheap\\_battery\(\)](https://github.com/ojdo/urbs/tree/haag15/rivhg15.py:scenario_cheap_battery())

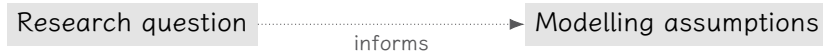
## Section 3

### Sustainable model use

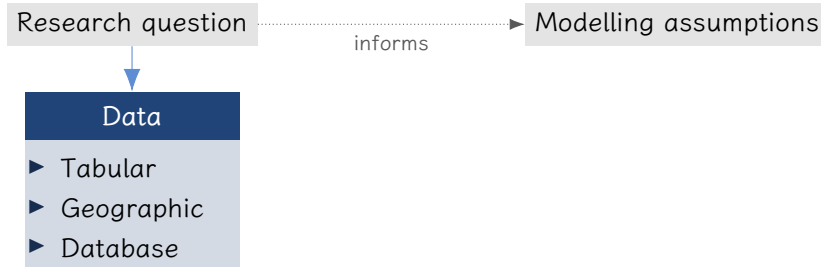
# Optimisation model workflow

Research question

# Optimisation model workflow



# Optimisation model workflow

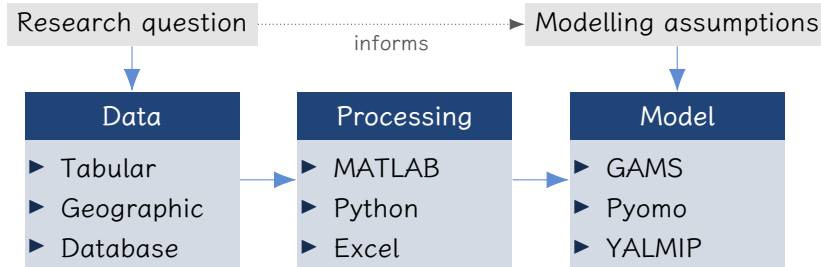




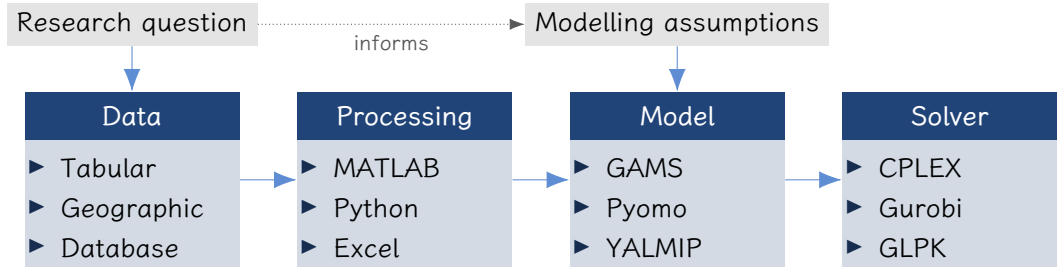
# Optimisation model workflow



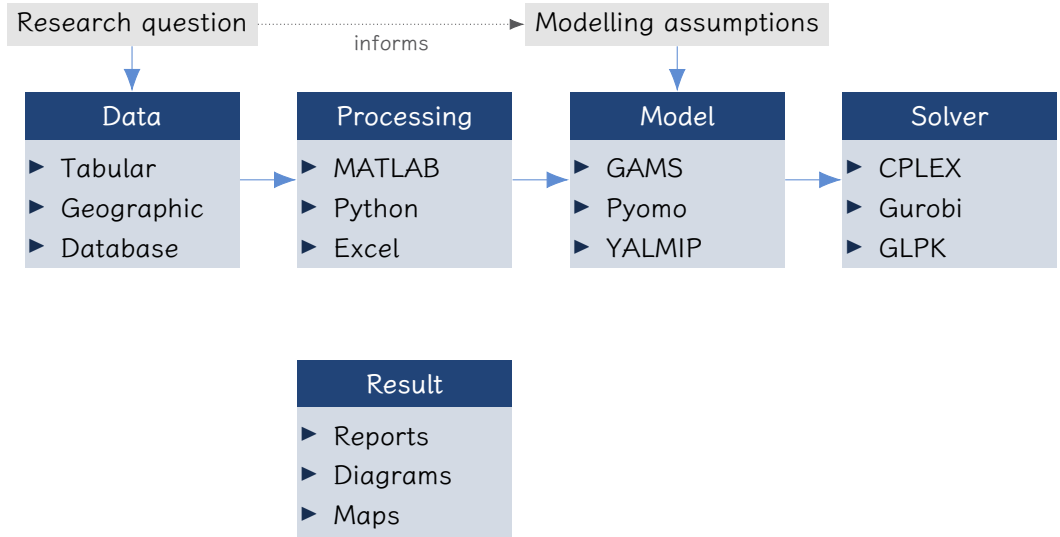
# Optimisation model workflow



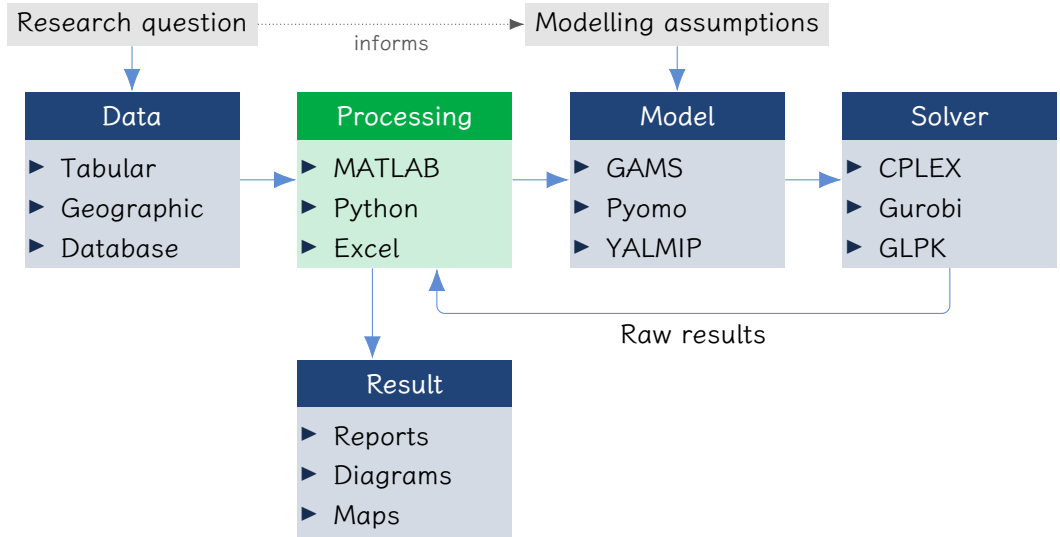
# Optimisation model workflow



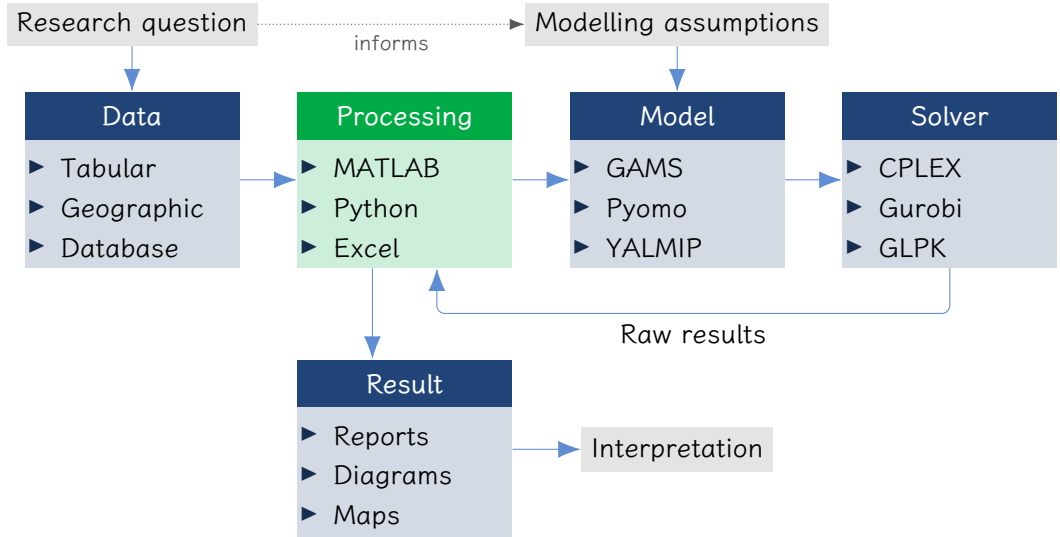
# Optimisation model workflow



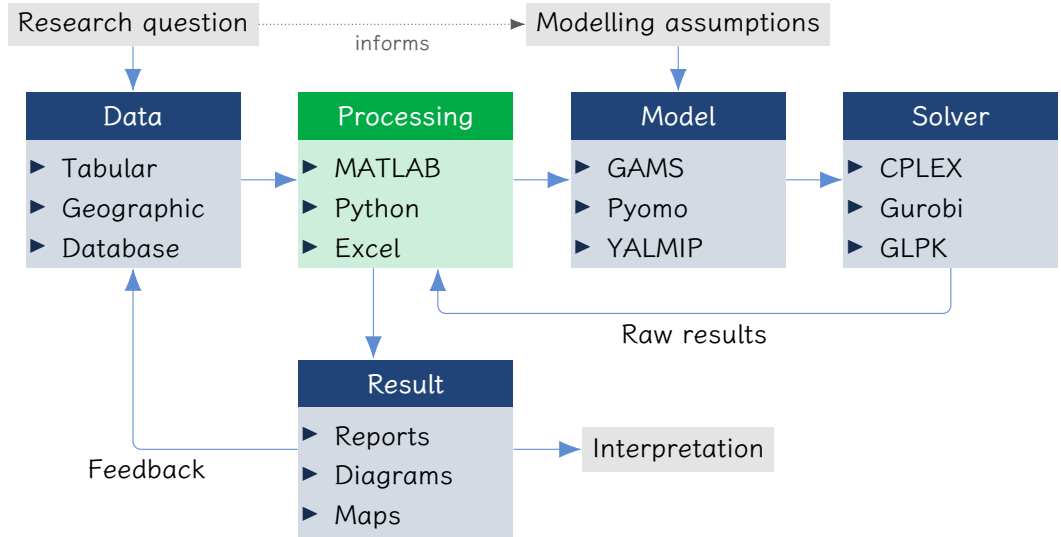
# Optimisation model workflow



# Optimisation model workflow



# Optimisation model workflow



# Distributed version control for scientific work





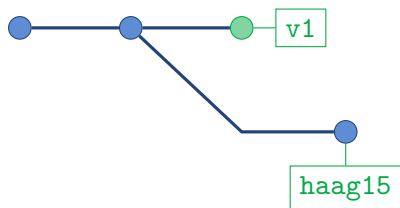
# Distributed version control for scientific work



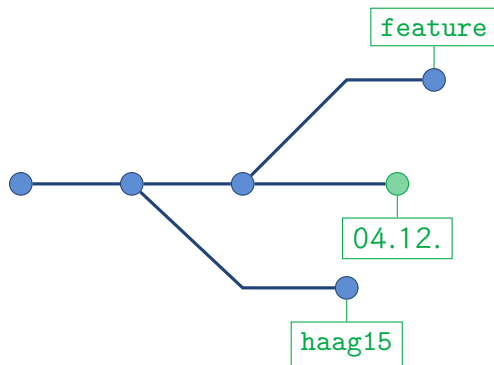
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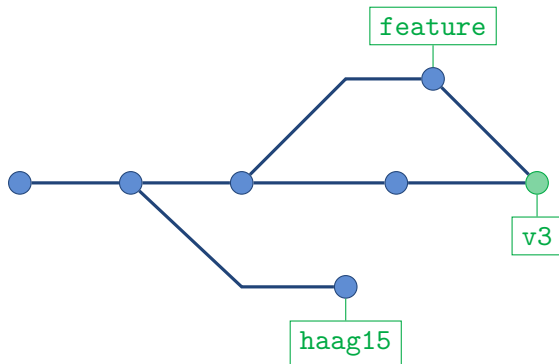
# Distributed version control for scientific work



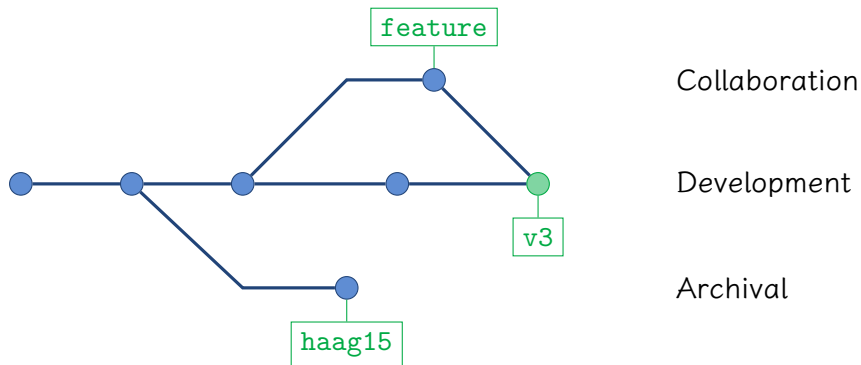
# Distributed version control for scientific work

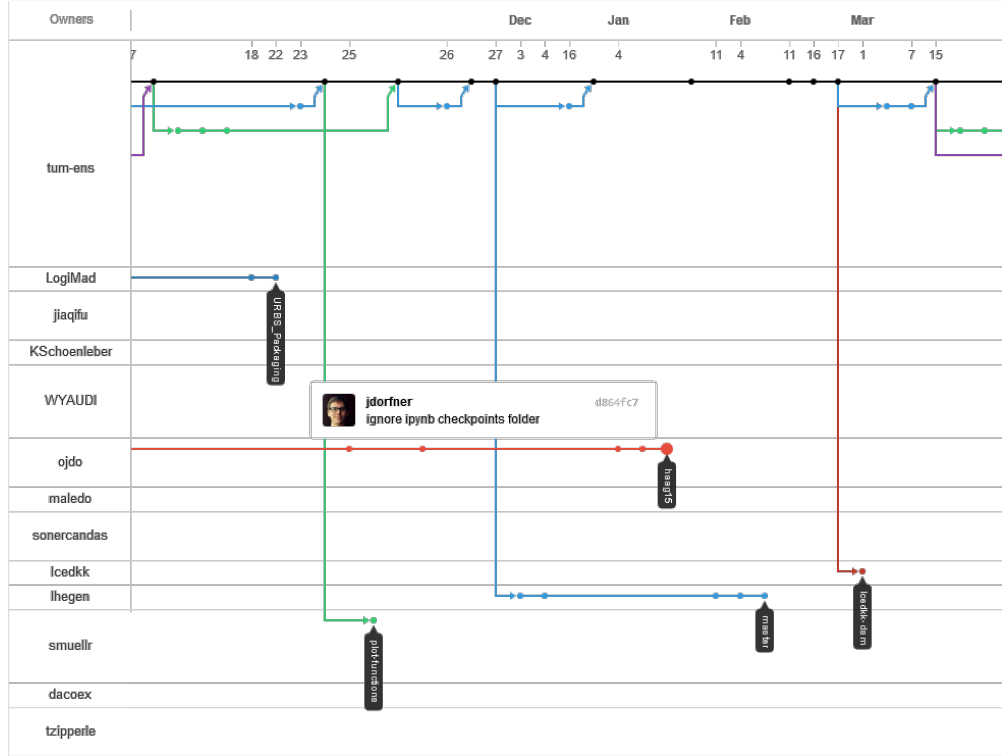


# Distributed version control for scientific work



# Distributed version control for scientific work





## Conclusion

# Infrastructure

## Engineering

Technical  
feasibility  
(Technologies)

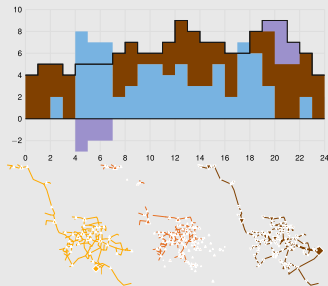
## Economy

Economic  
feasibility  
(Funding)

## Techno-economic modelling

How much energy? For how much?

## Modelling



## Open Source

