

Quantification of thermal resilience in buildings

Evaluation of Building Envelope Performance and Operational Parameters

Building Technology Graduation Project

Nathanail Tzoutzidis | 5611725

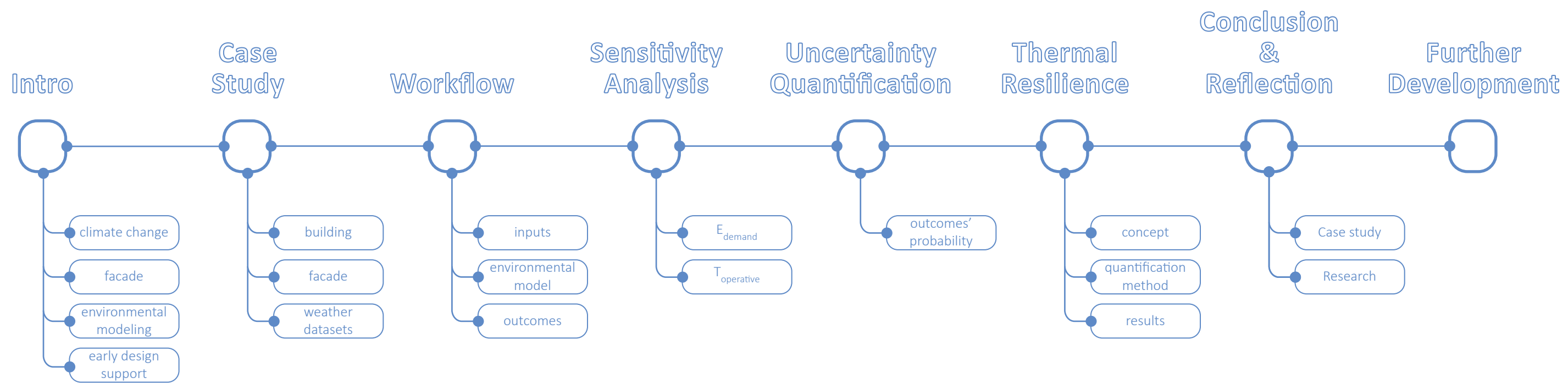
Simona Bianchi , Resilient Structural & Climate Design

Charalampos Andriotis , AI in Structural Design & Mechanics

Jonathan Ciurlanti, Arup

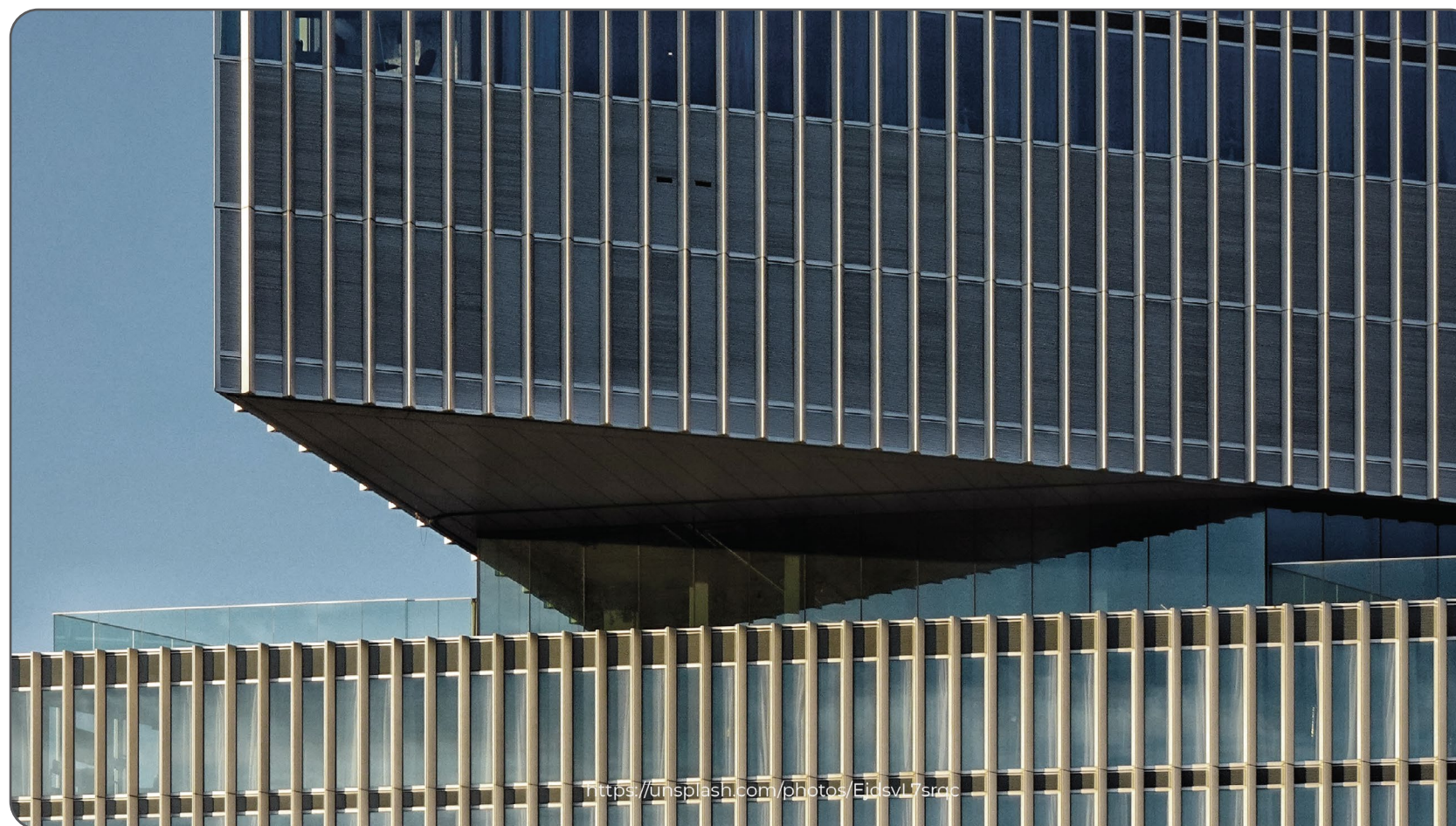
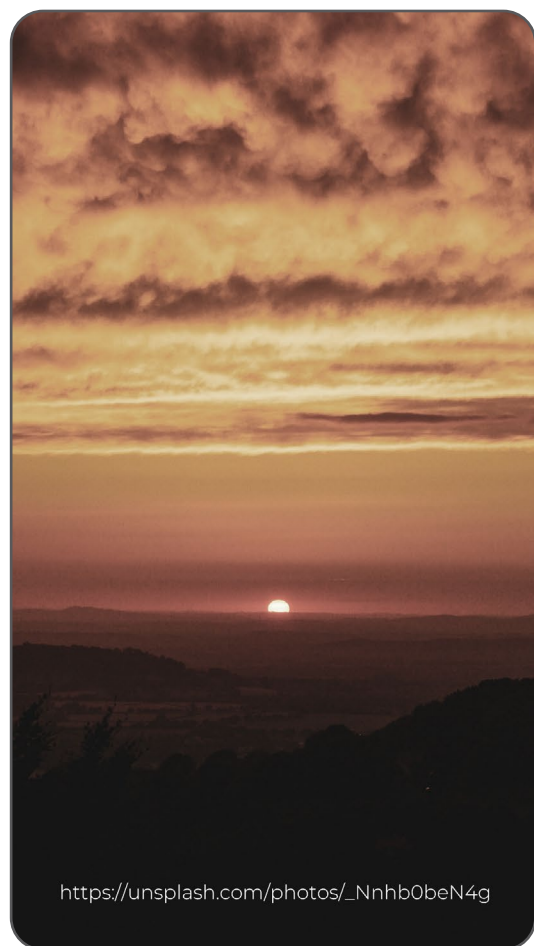
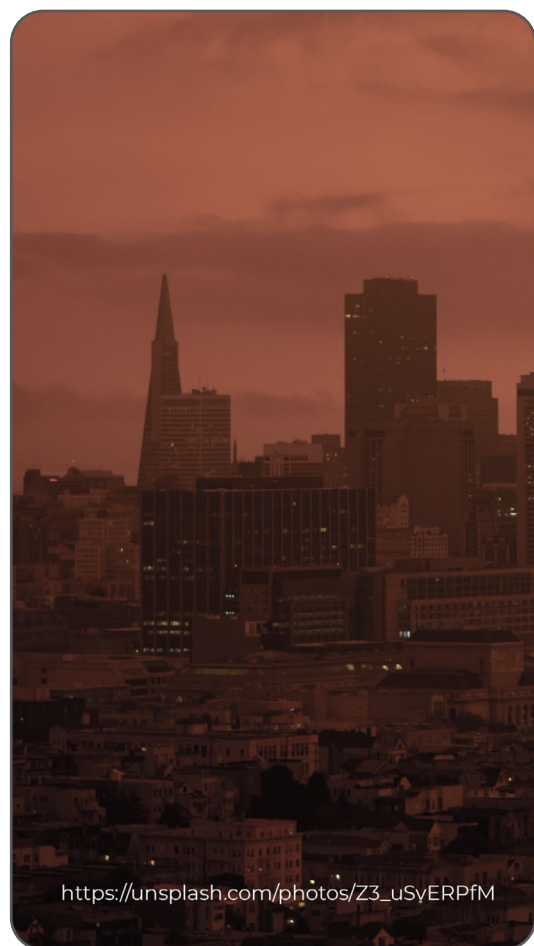


"I am developing a **dynamic** computational **workflow**, that can be utilized at the **early stage** of the design process, for assessing the **thermal resilience** of buildings against extreme over heat stresses, by alternating building's and material **properties**."



Climate Change & Early Design Support





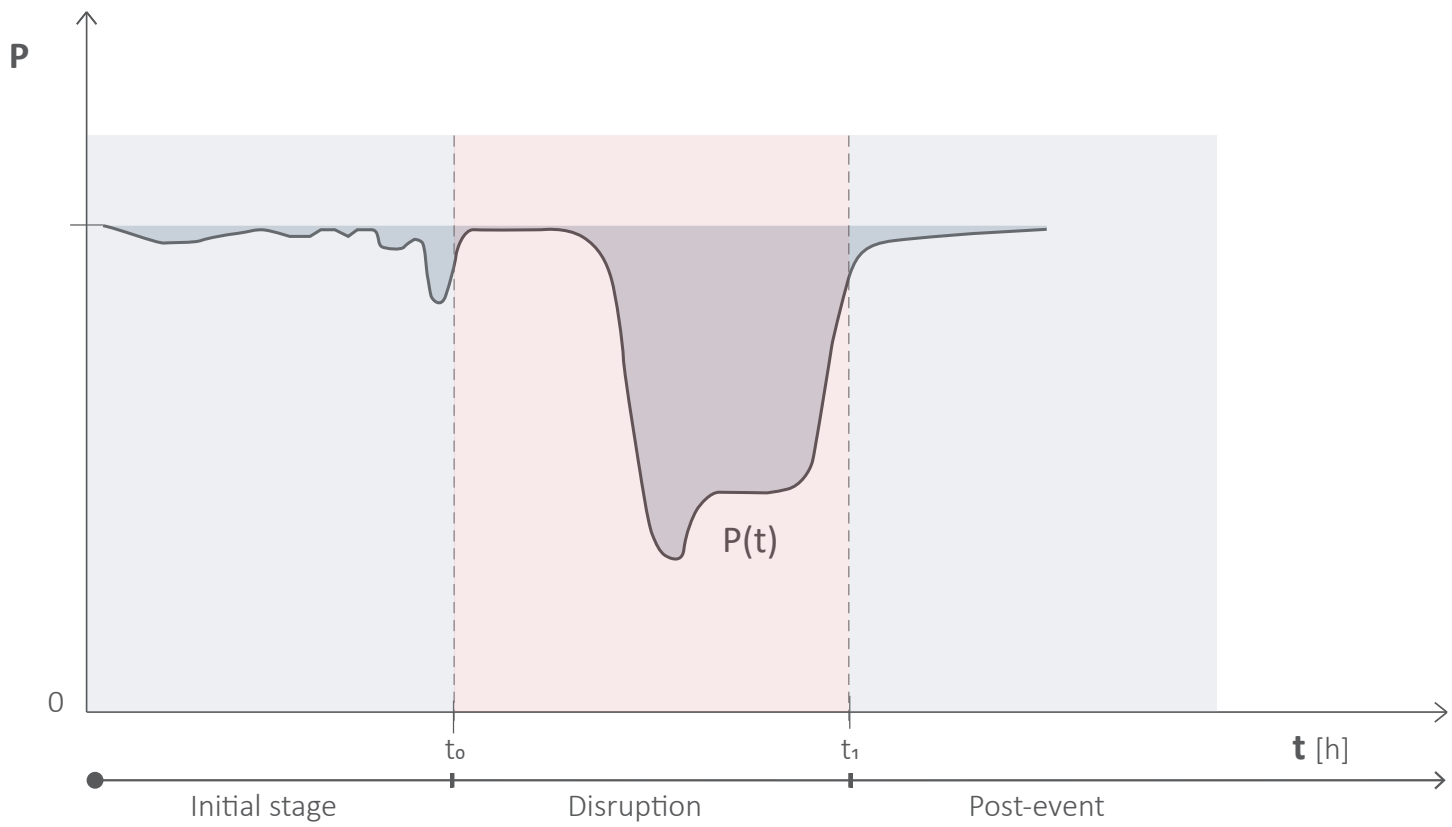
Climate change

Intro



Definition

“Thermal resilience is the capability of the building to prepare, absorb, adapt and recover from overheating events.”

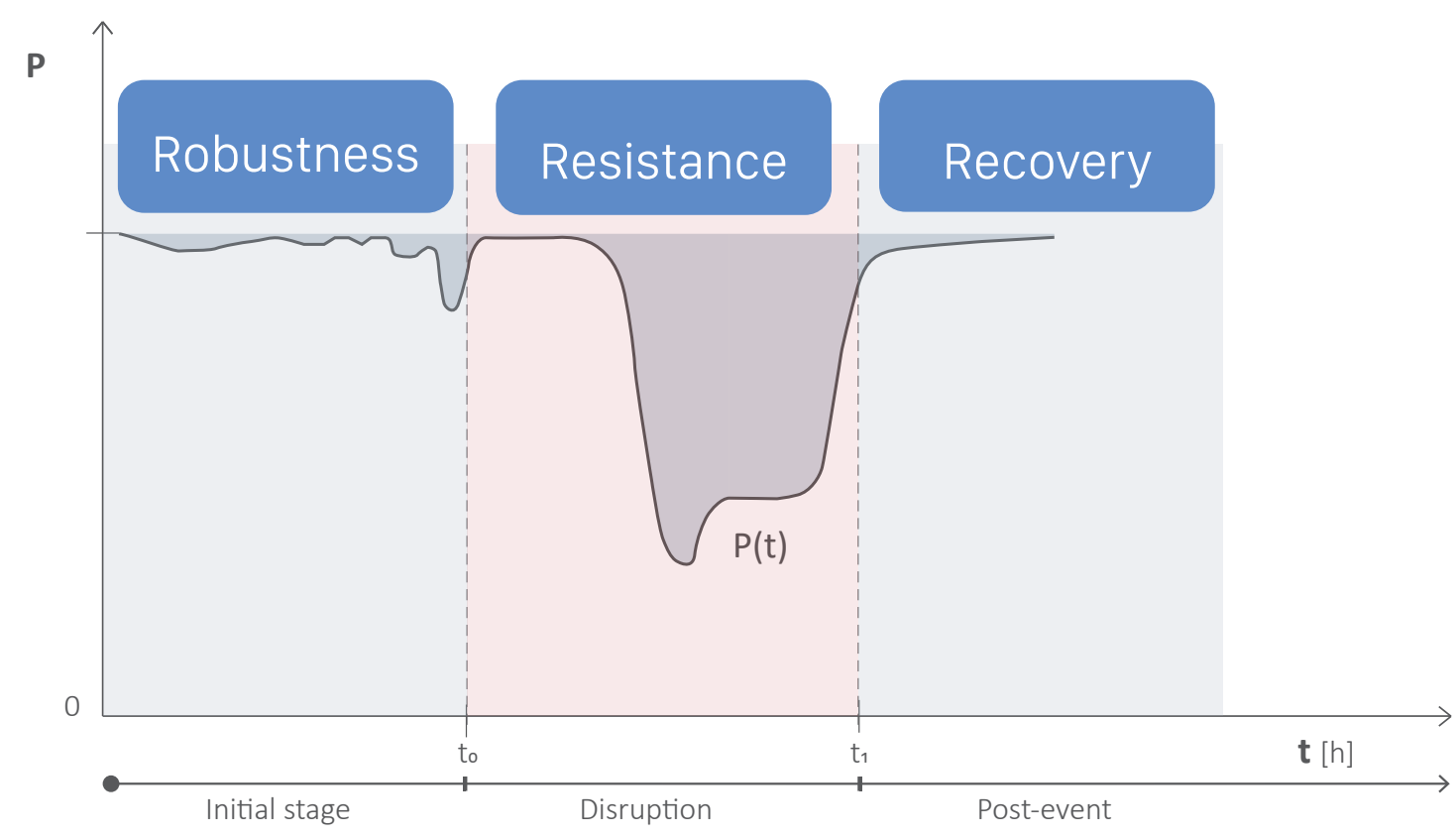


Resilience



Definition

“Thermal resilience is the capability of the building to prepare, absorb, adapt and recover from overheating events.”



Resilience



Key Performance Indicators

Indoor comfort

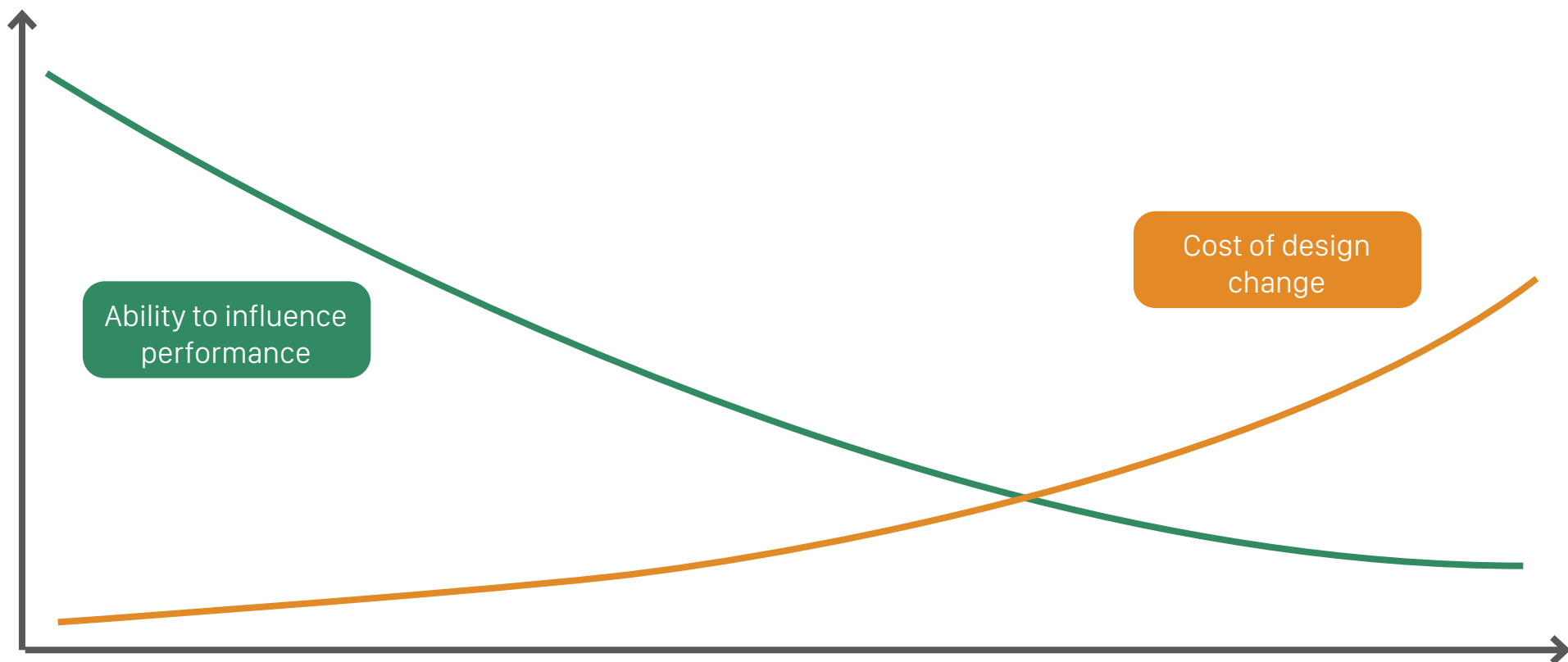
Energy Demand



Environmental Analysis

Intro





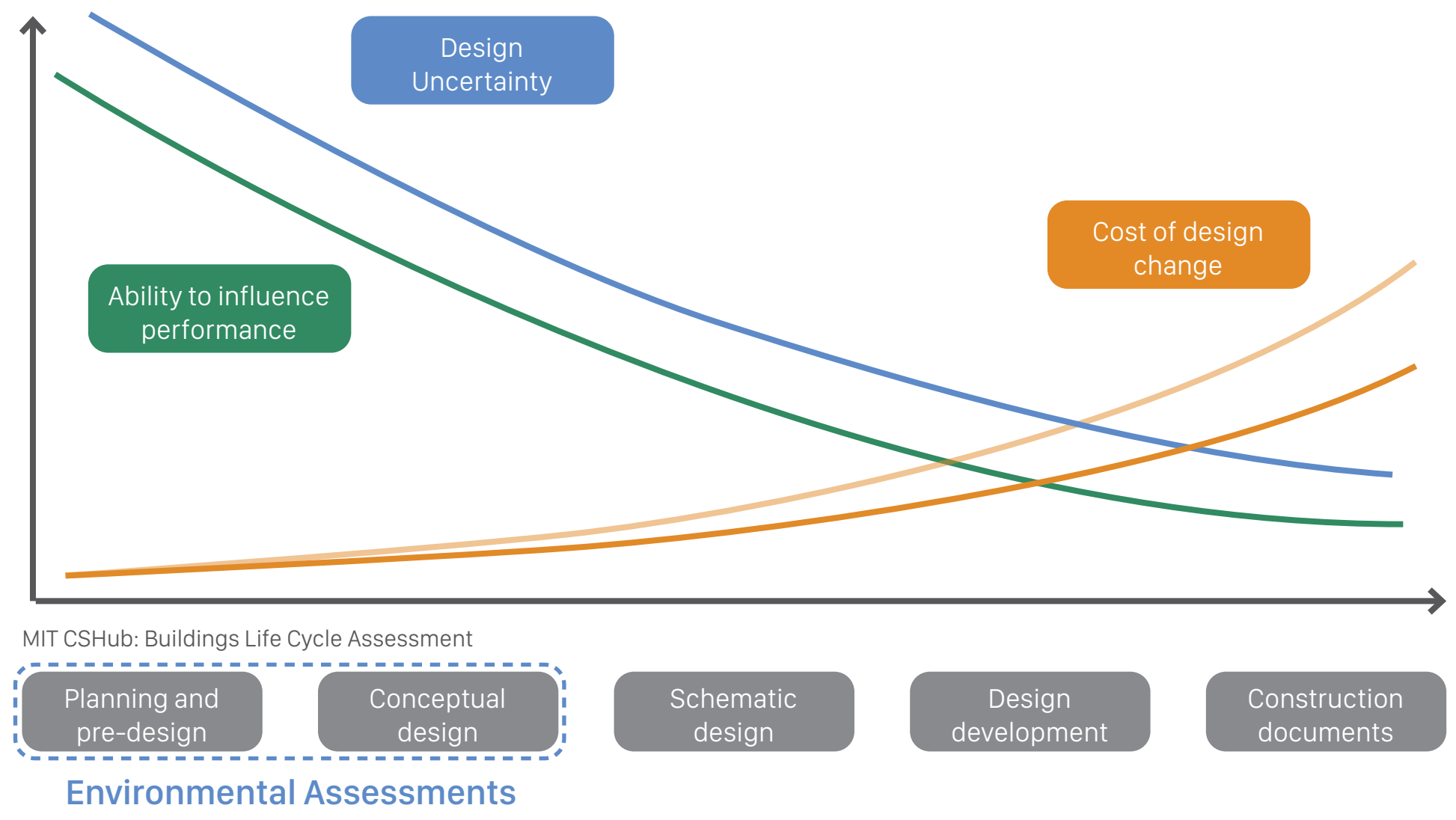
MIT CSHub: Buildings Life Cycle Assessment



Environmental Assessments

Early design support





Early design support



gain new knowledge regarding the field of **thermal resilience** in buildings by pointing out the thermal resilience **definition** and its **indicators** that should be quantified

implement **uncertainty quantification** method in order to point out the **probability of results**

define a **computational workflow** for assessing thermal resilience of buildings against overheating via dynamic environmental simulation method

bridge the gap between qualitative and **quantitative assessment** of thermal resilience in buildings and indicate the **influence** of facade and buildings systems **parameters** to **performance**

Objectives

Intro



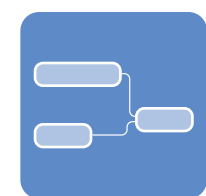
“In what manner can a digital design **workflow** be devised to assess the **thermal resilience** of buildings against **extreme heat wave** stresses, and how it can support designers and engineers in the **decision-making** process during the **early design stage**?”



Definition
Indicators
Metrics



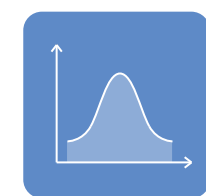
Climate change
Historical Data



Dynamic building
simulation



Facade & Building
libraries



Influential parameters
Probabilistic approach

Research question

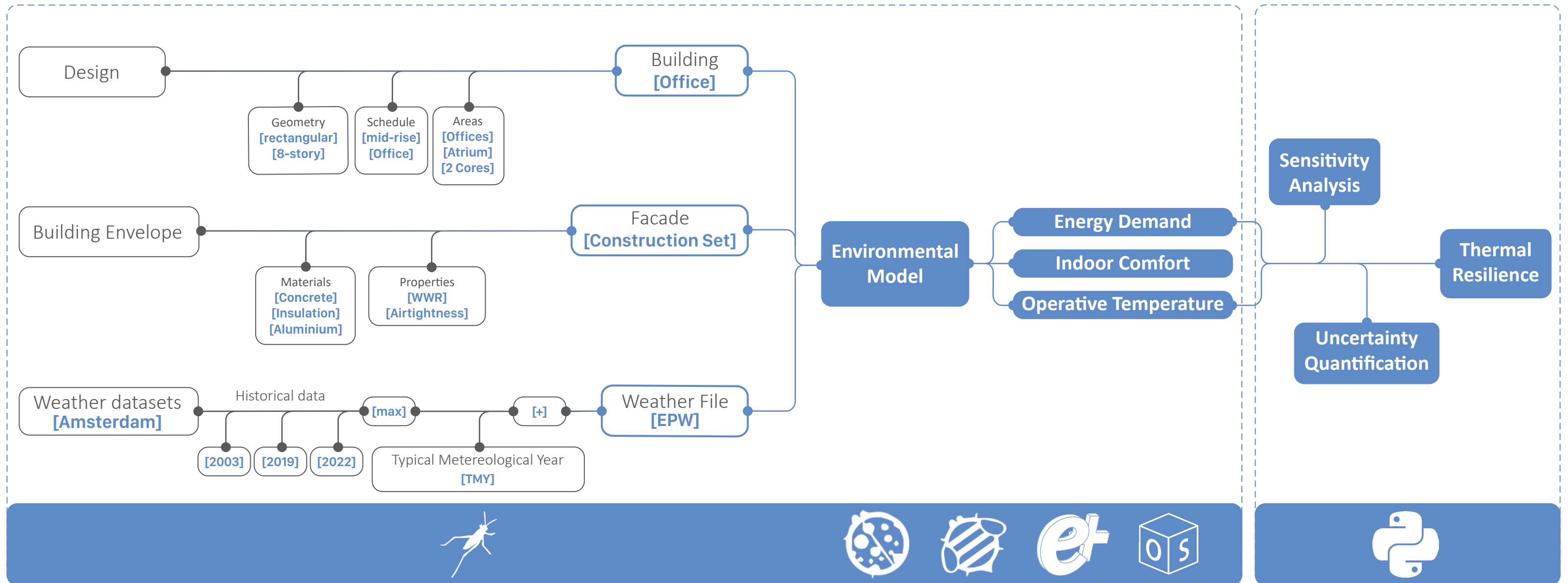
Intro



Case Study



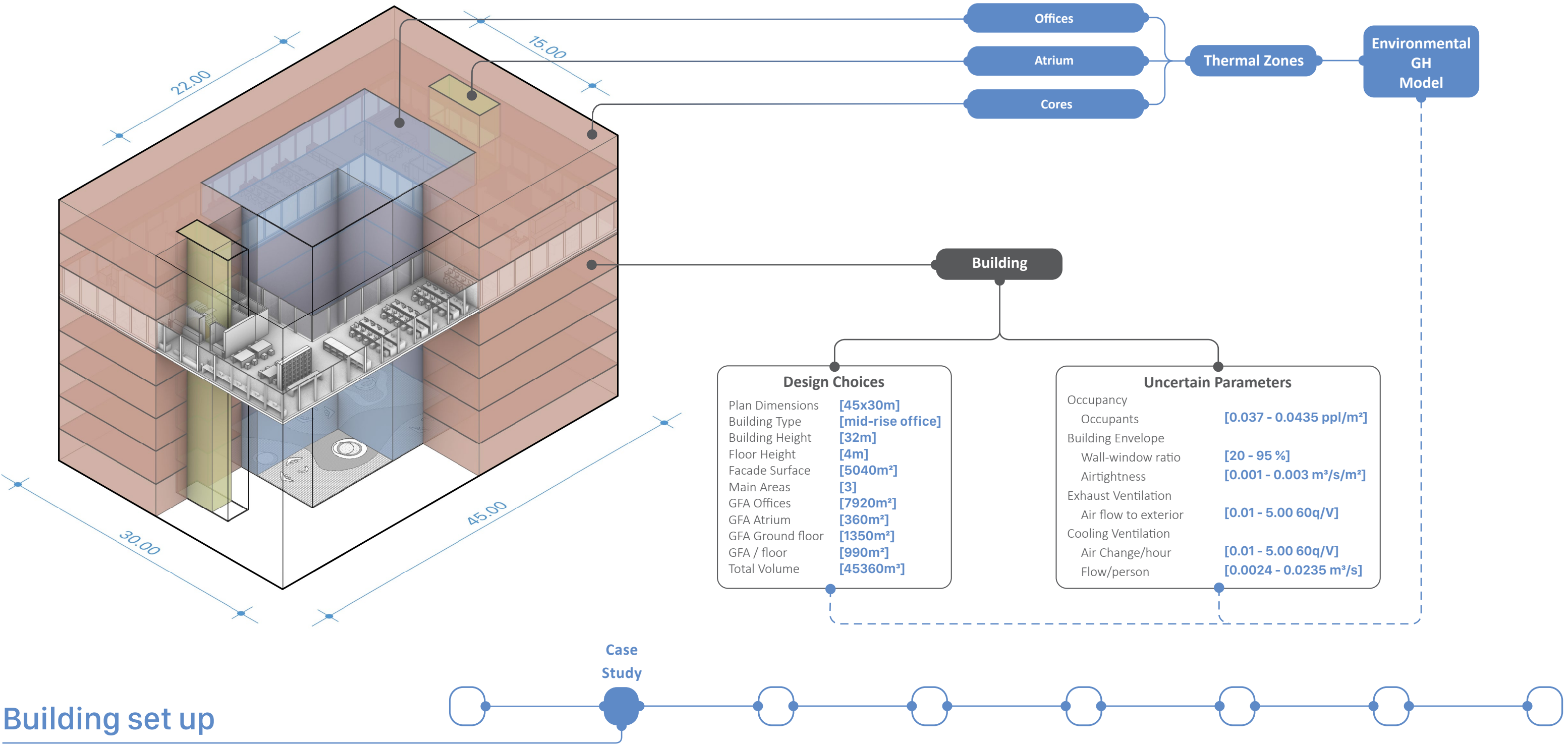
Case study set-up



Overview

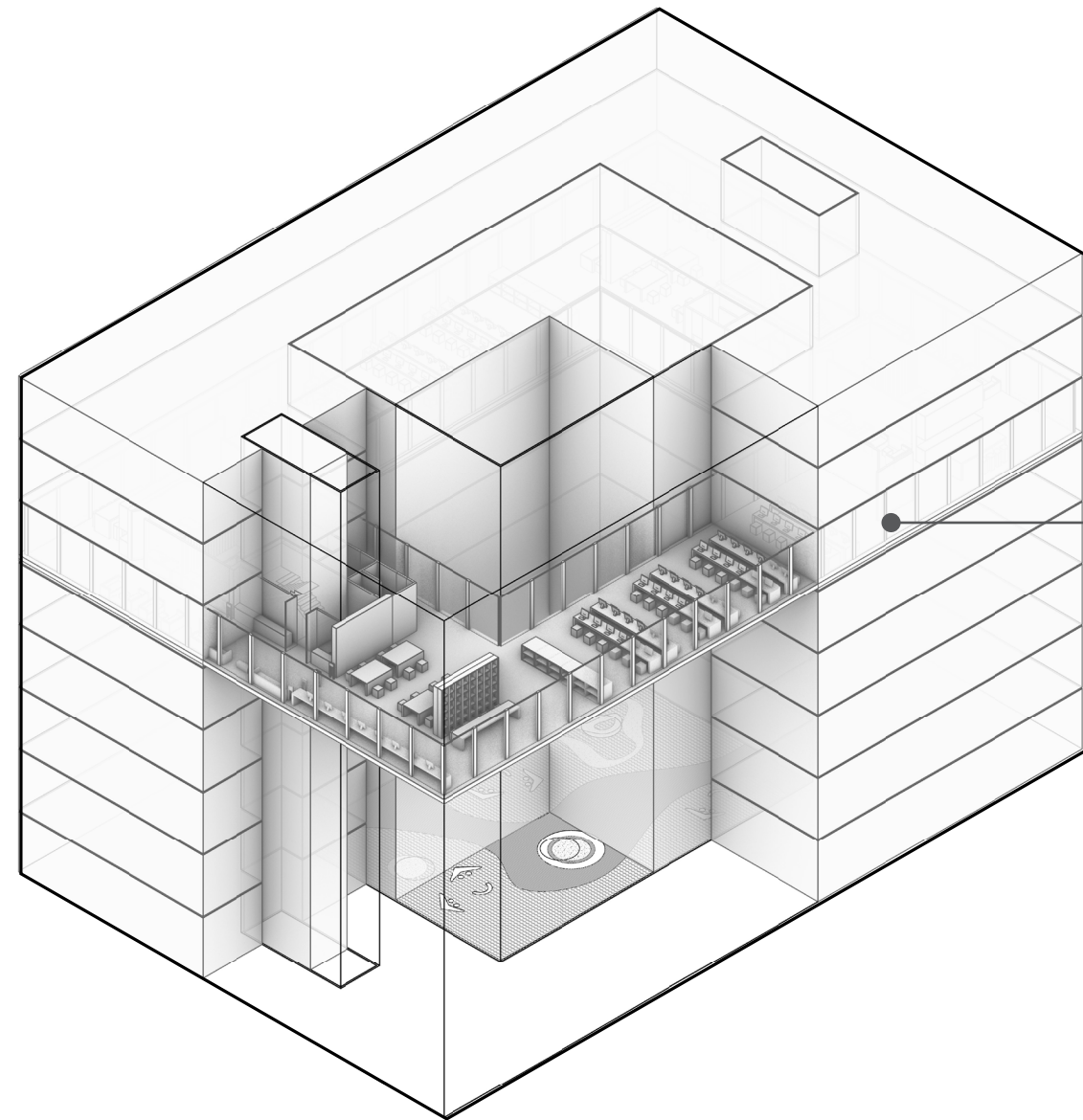


Case study set-up



Building set up

Case study set-up

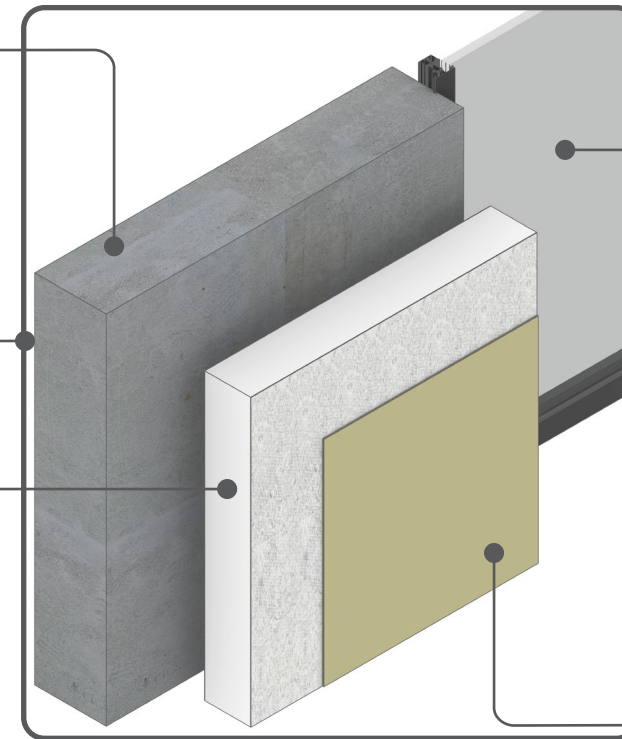


Concrete [lightweight]

| | |
|---------------------|------------------|
| Thickness | [0.15-0.35 m] |
| Conductivity | [1.20-2.0 W/mK] |
| Density | [800-2100 kg/m³] |
| SpecHeat | [840-1170 J/kgK] |
| Thermal absorbance | [0.75-0.95] |
| Solar Absortivity | [0.50-0.80] |
| Visible Absortivity | [0.10-0.70] |

Glass [double-tripple]

| | |
|-----------------------|------------------|
| U-value | [0.70-2.40 W/m²] |
| SHGC | [0.30-0.90] |
| Visible Transmittance | [0.20-0.80] |



Thermal Insulation [EPS-XPS]

| | |
|---------------------|--------------------|
| Thickness | [0.035-0.15 m] |
| Conductivity | [0.024-0.038 W/mK] |
| Density | [28-45 kg/m³] |
| SpecHeat | [1300-1700 J/kgK] |
| Thermal absorbance | [0.85-0.95] |
| Solar Absortivity | [0.80-0.90] |
| Visible Absortivity | [0.80-0.90] |

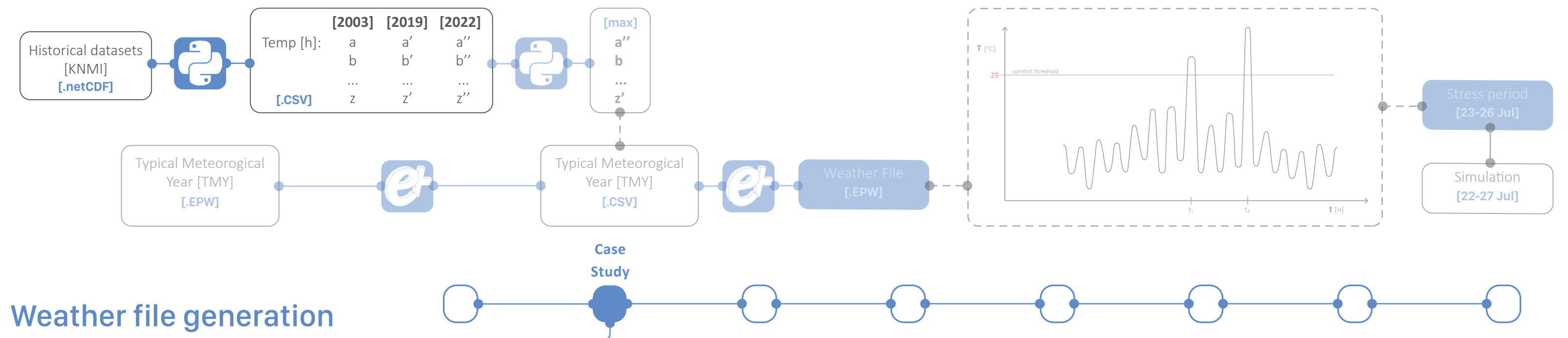
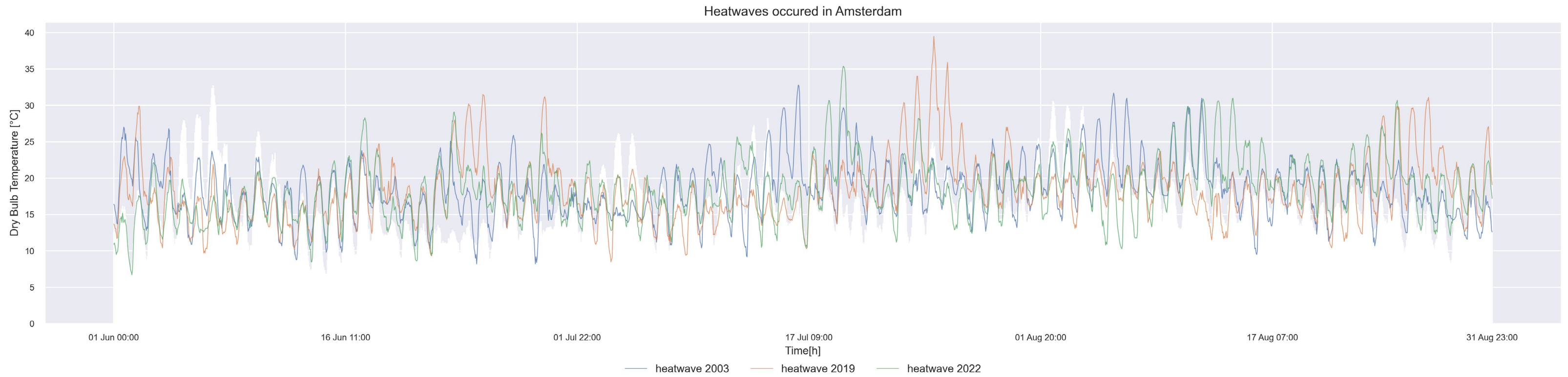
Aluminium Cladding [-]

| | |
|---------------------|-------------------|
| Thickness | [0.001-0.0085 m] |
| Conductivity | [120-240 W/mK] |
| Density | [2700-2800 kg/m³] |
| SpecHeat | [1215-900 J/kgK] |
| Thermal absorbance | [0.05-0.20] |
| Solar Absortivity | [0.20-0.40] |
| Visible Absortivity | [0.20-0.40] |

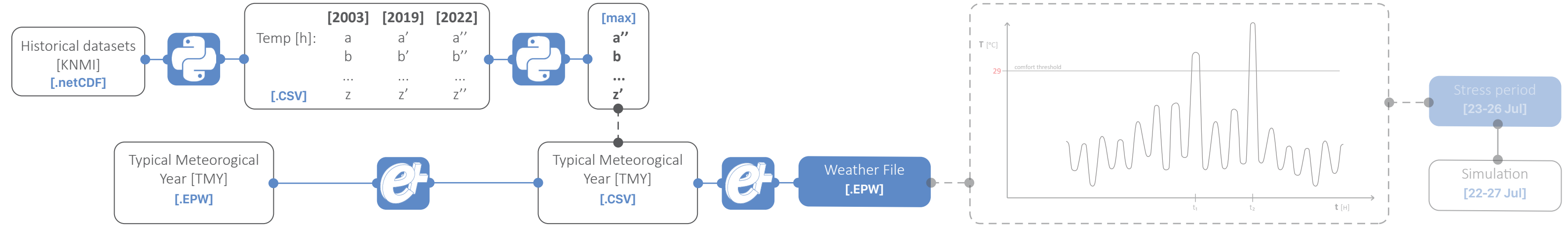
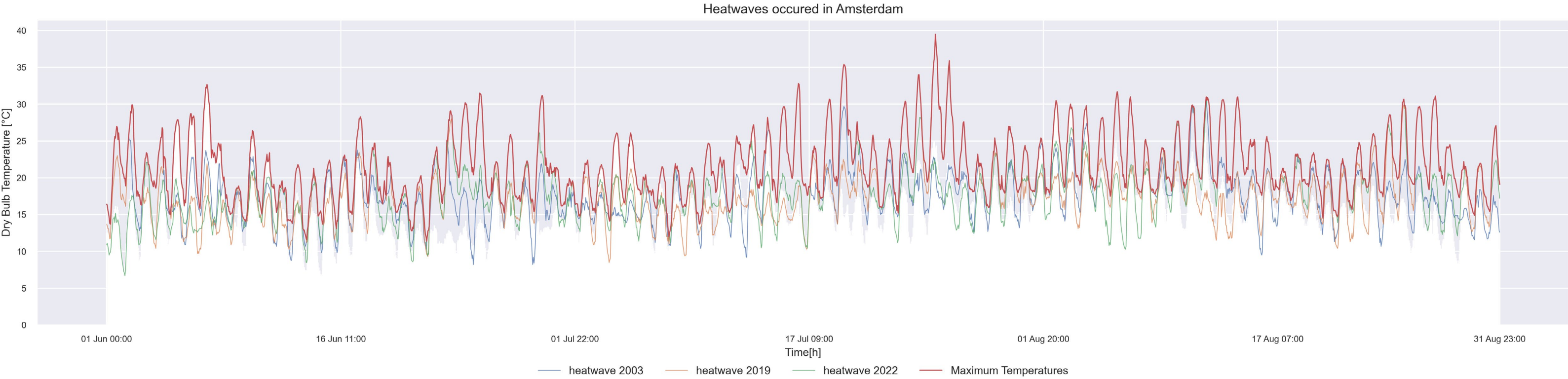
Facade set up



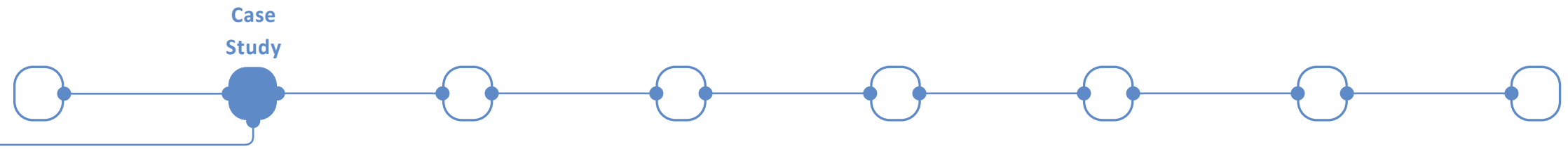
Case study set-up



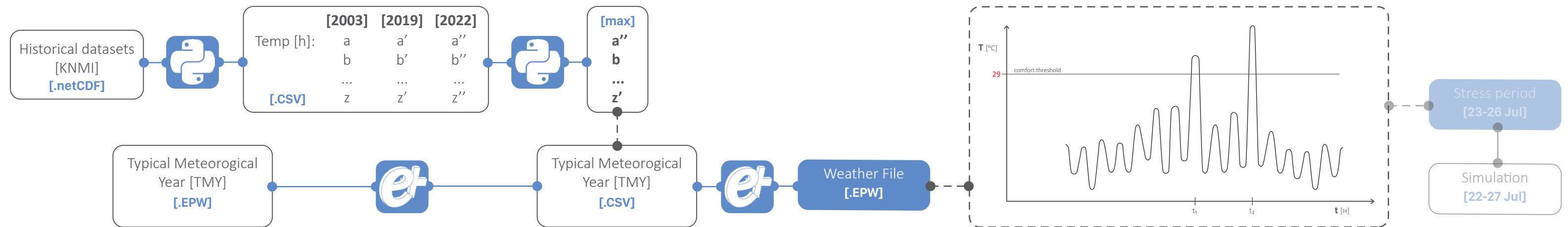
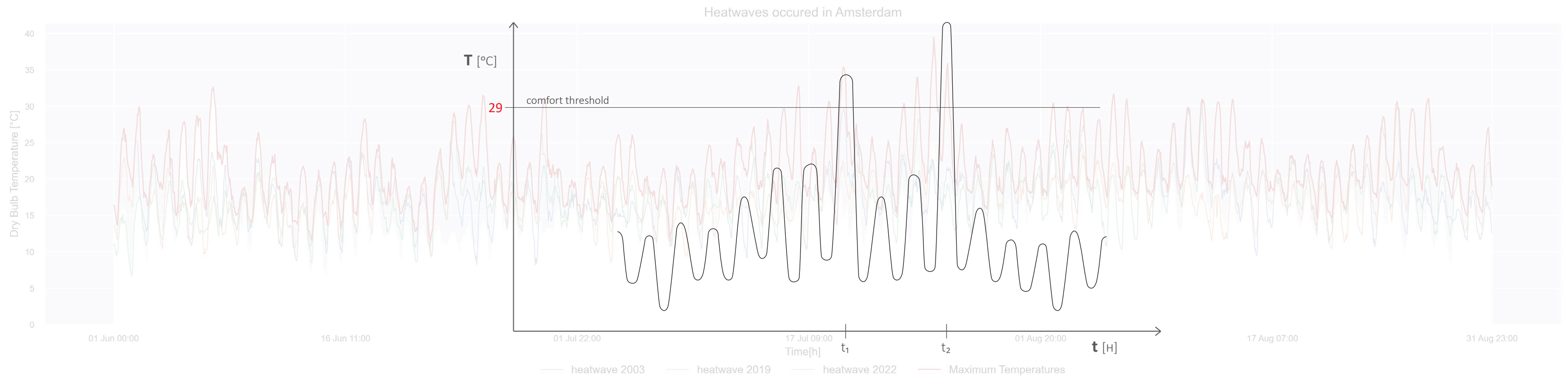
Case study set-up



Extreme Temperatures



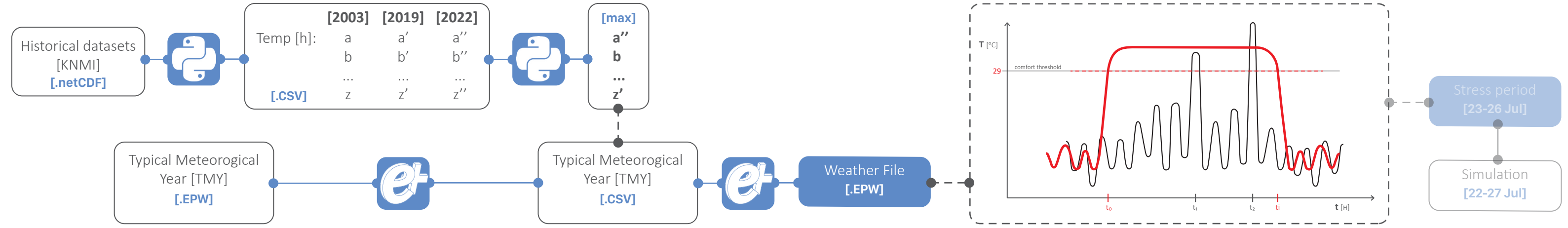
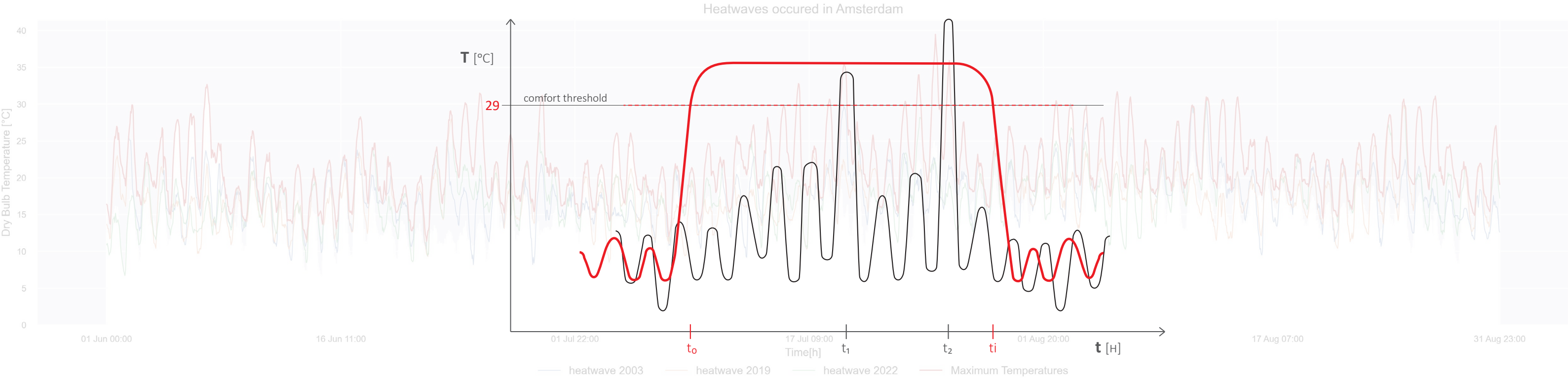
Case study set-up



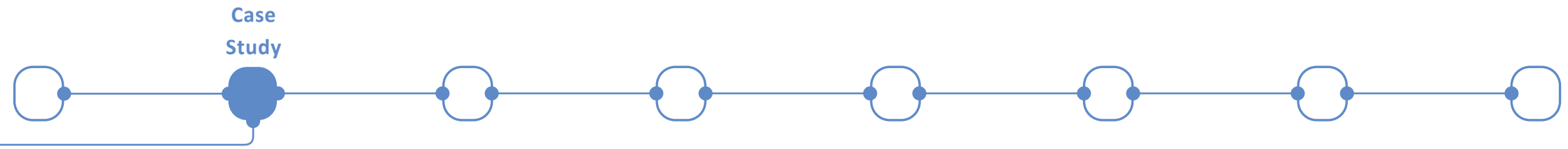
Heat stress concept



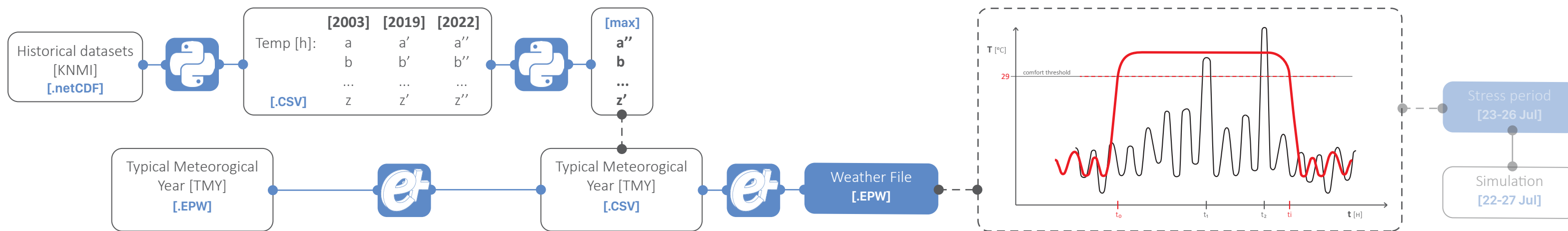
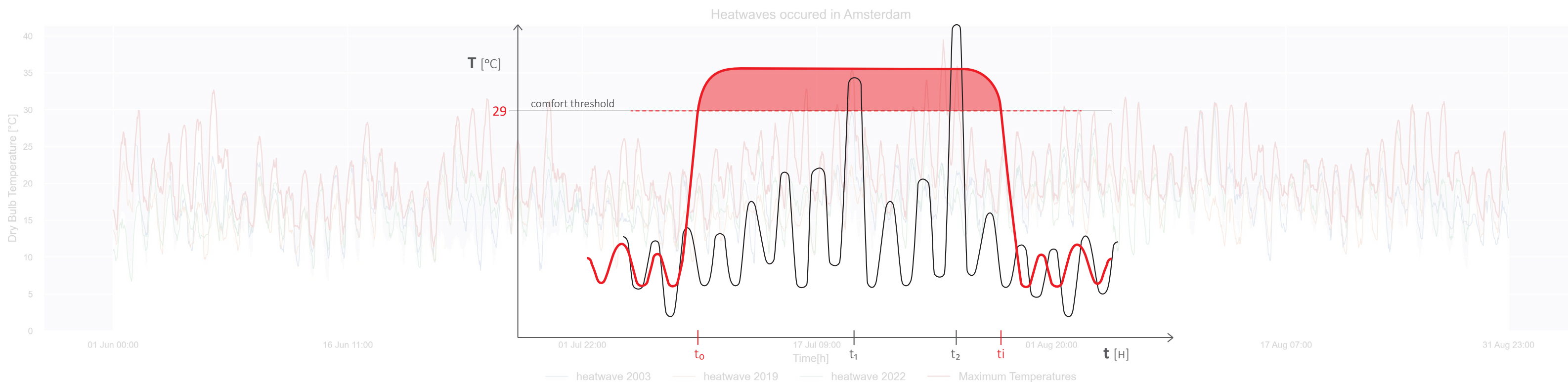
Case study set-up



Heat stress concept



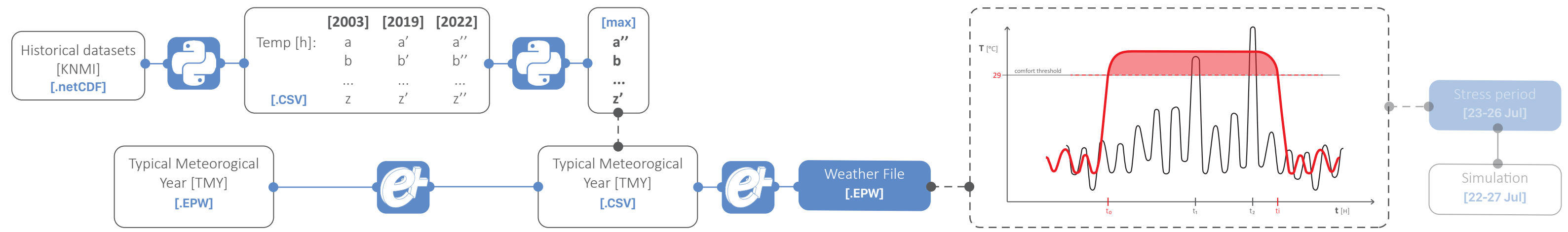
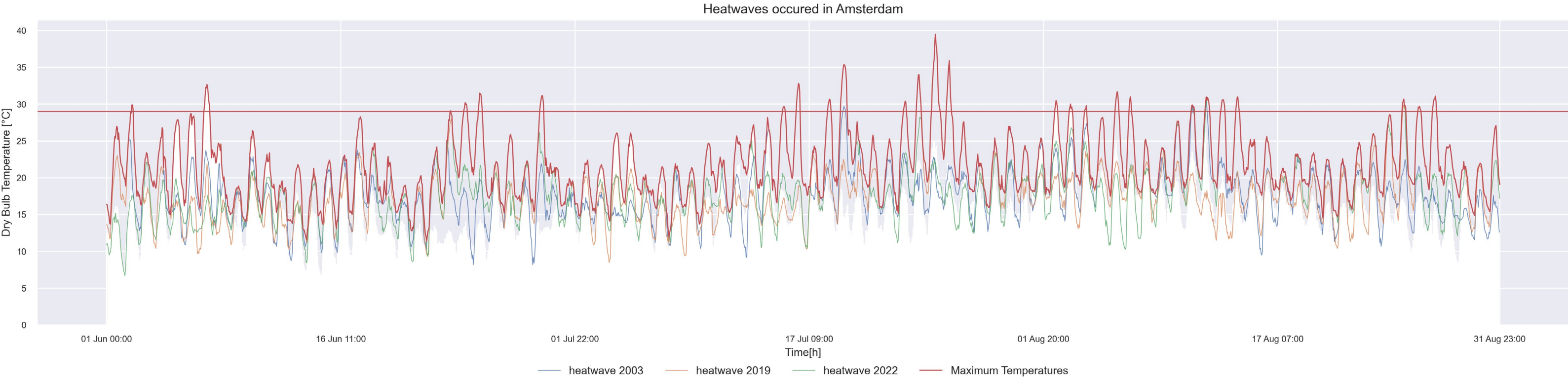
Case study set-up



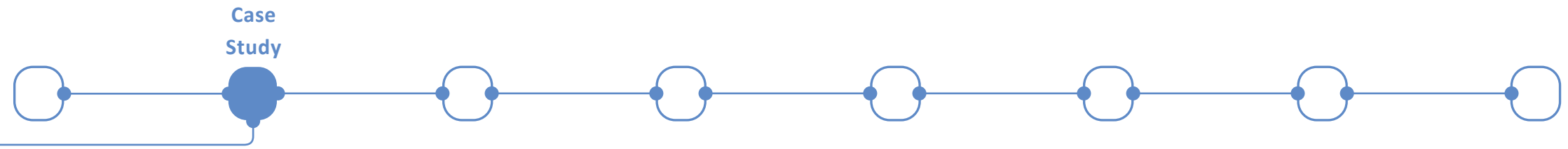
Heat stress concept



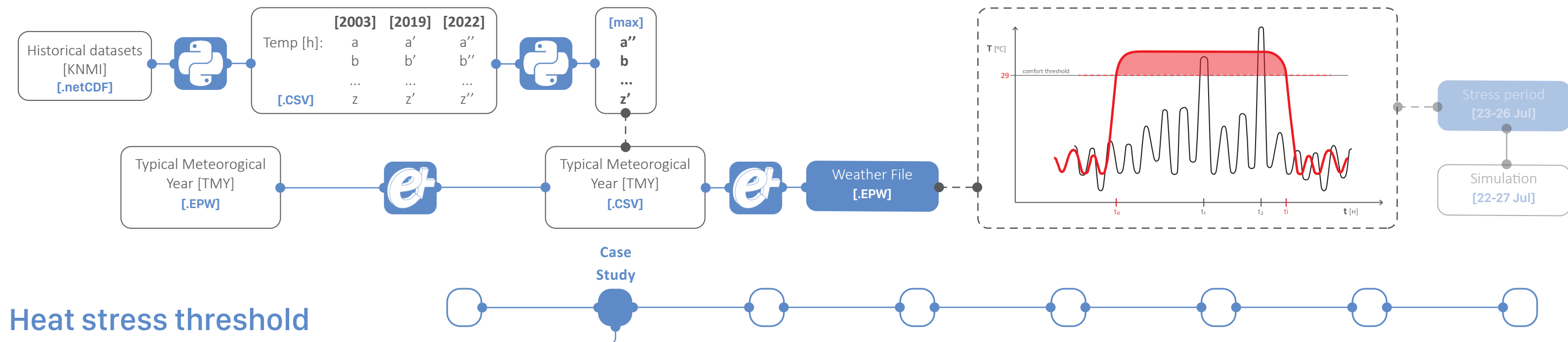
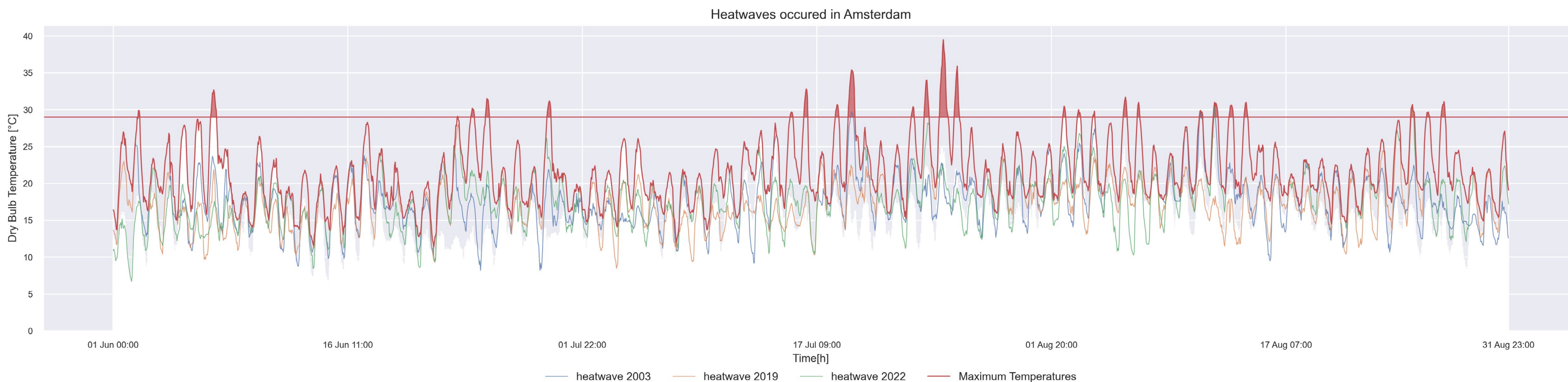
Case study set-up



Heat stress threshold

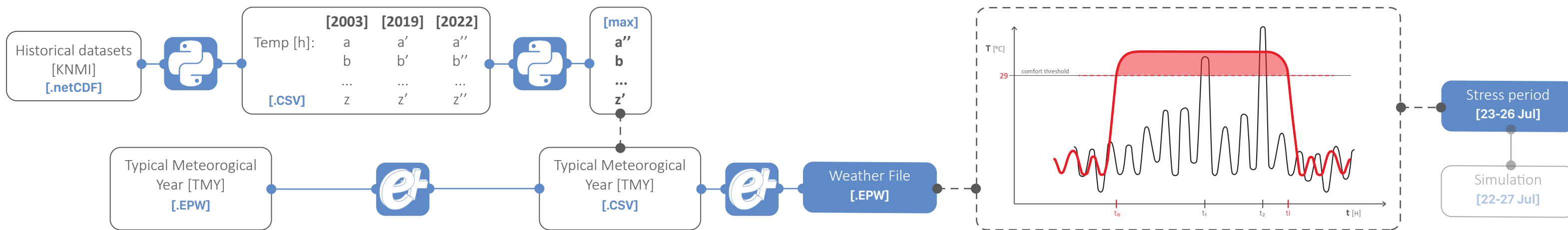
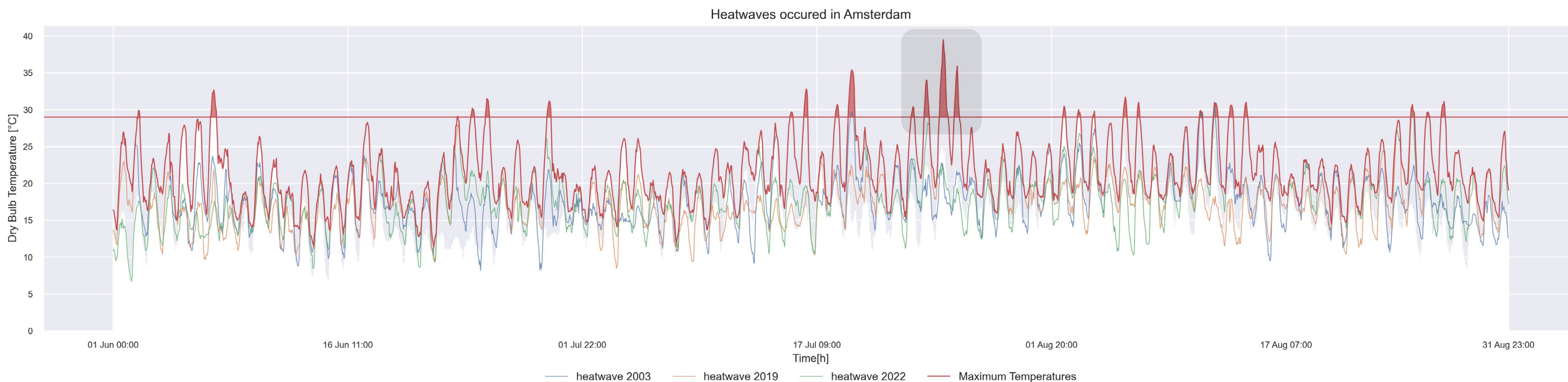


Case study set-up



Heat stress threshold

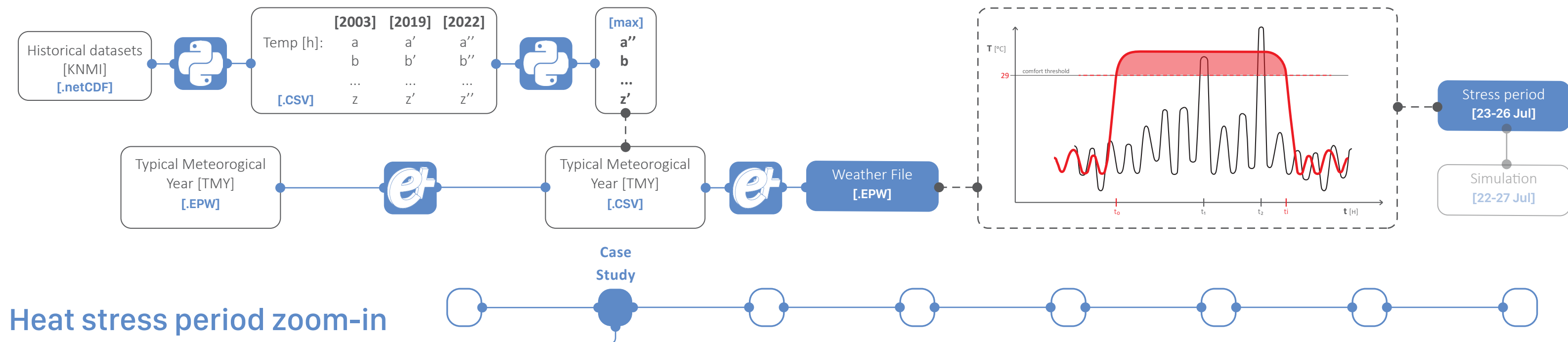
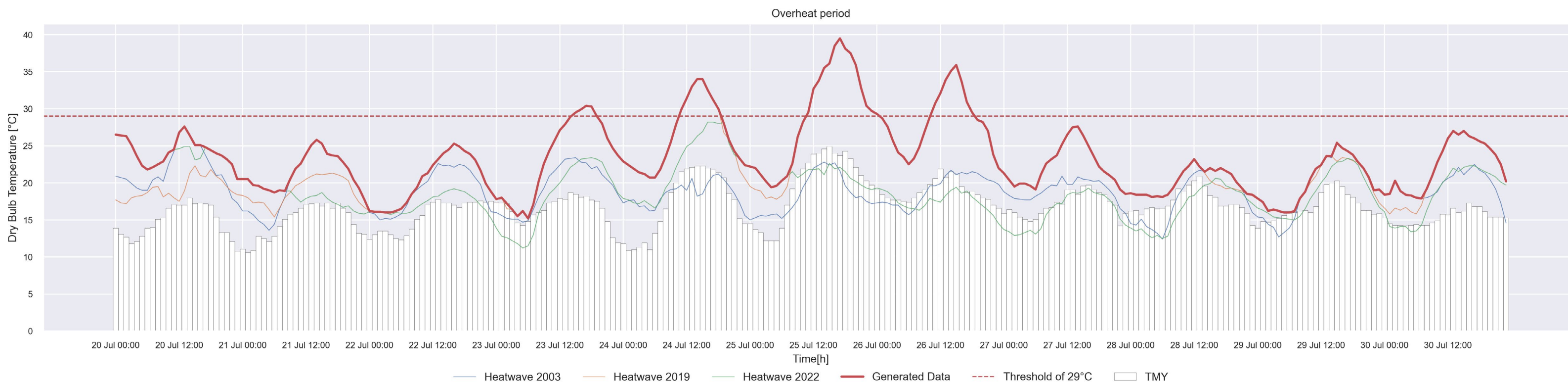
Case study set-up



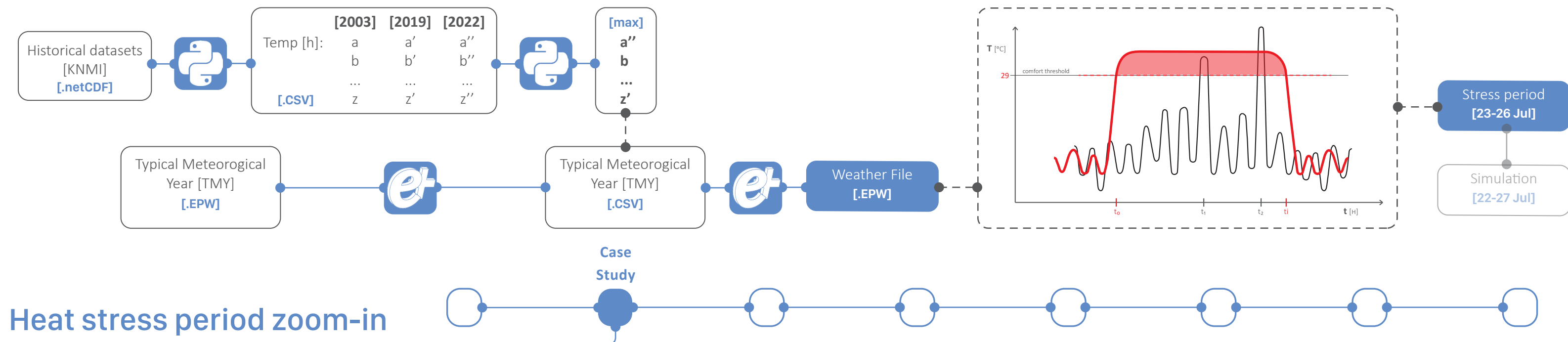
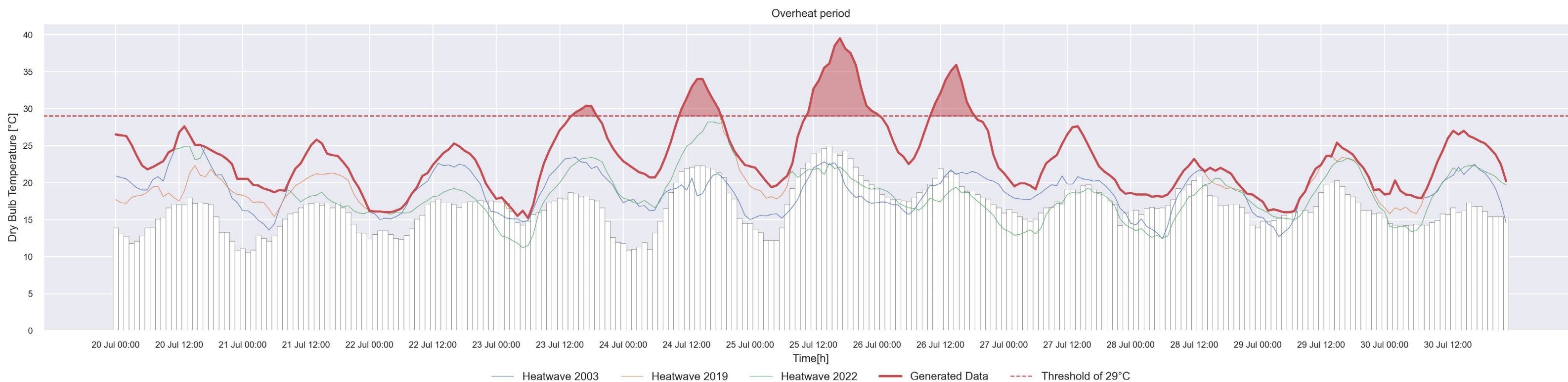
Heat stress period



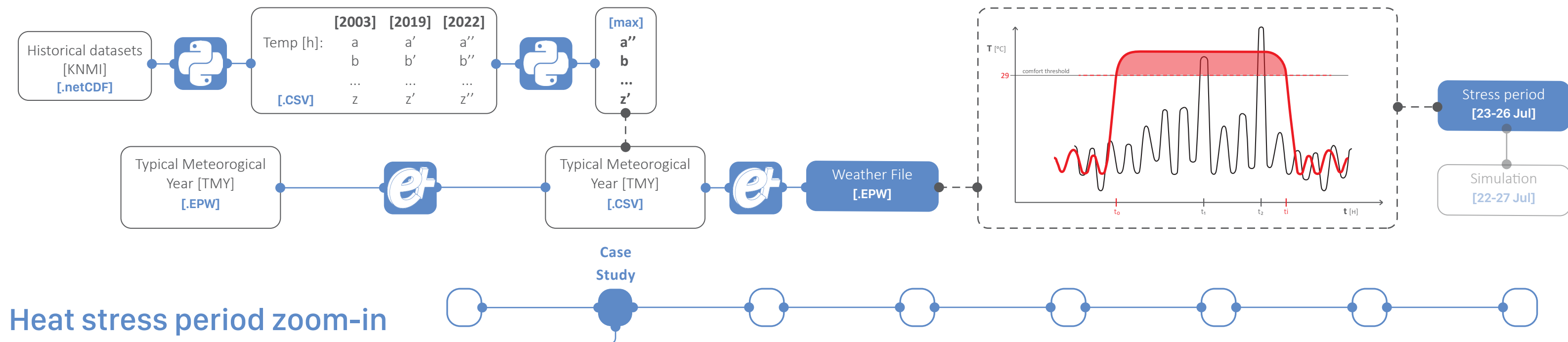
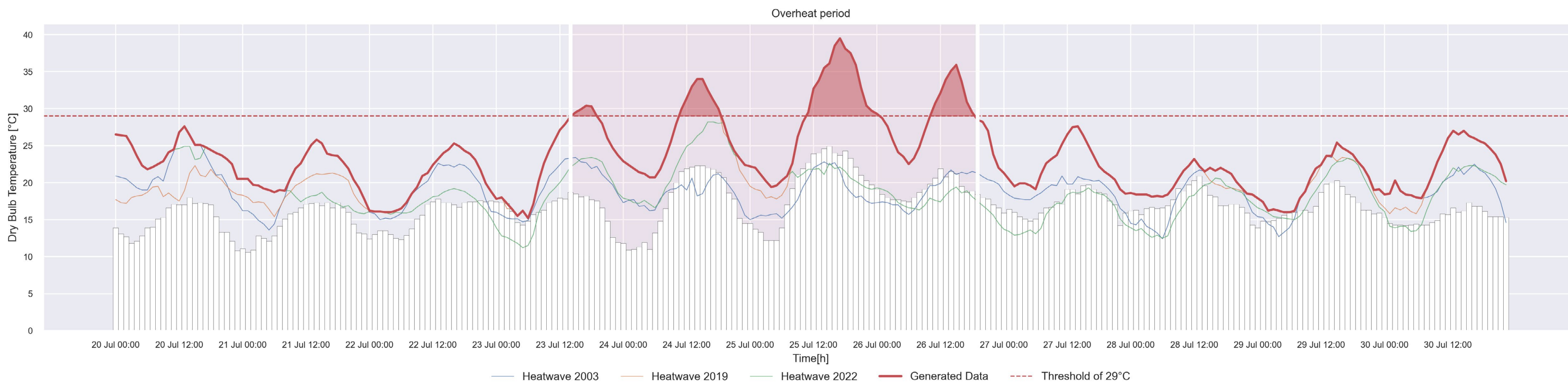
Case study set-up



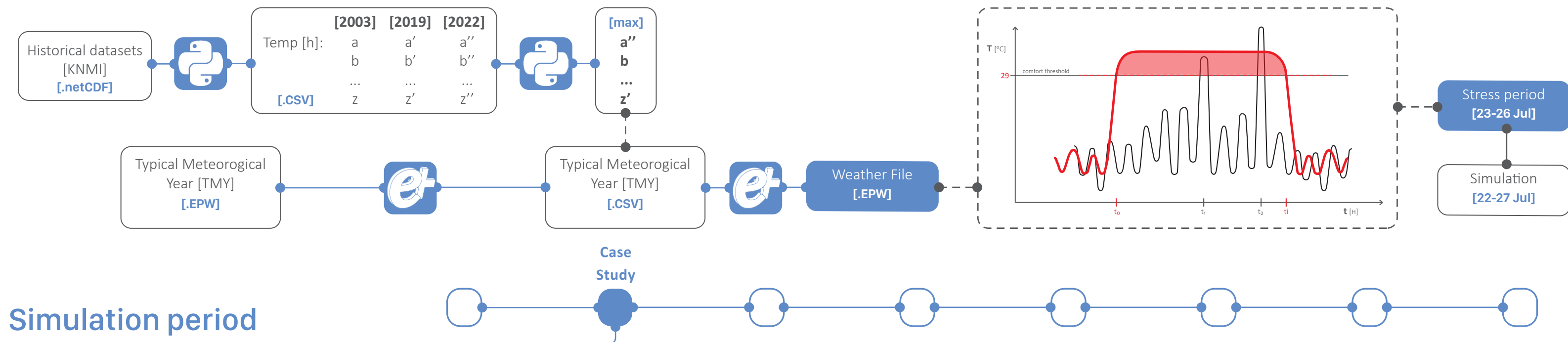
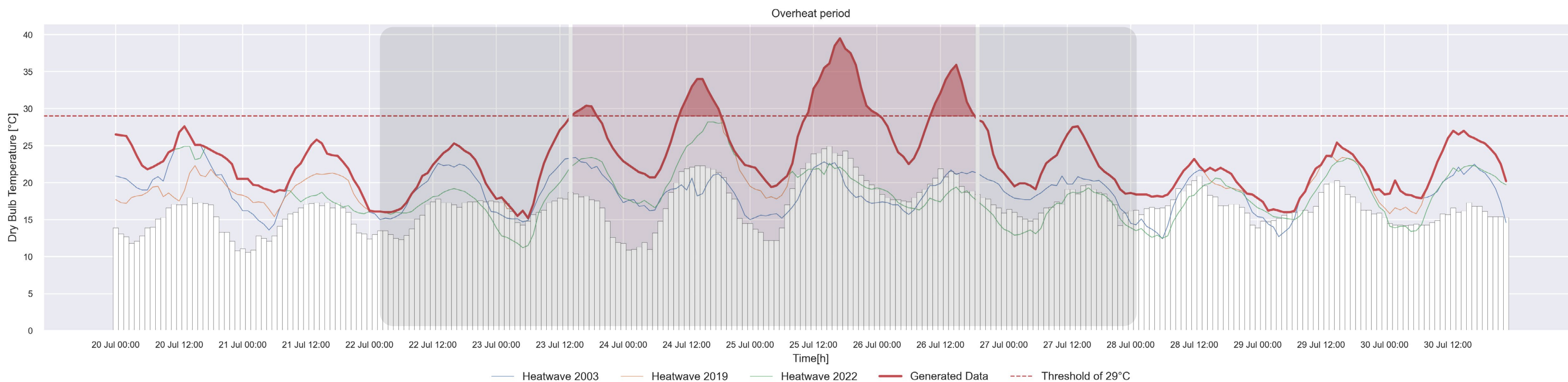
Case study set-up



Case study set-up



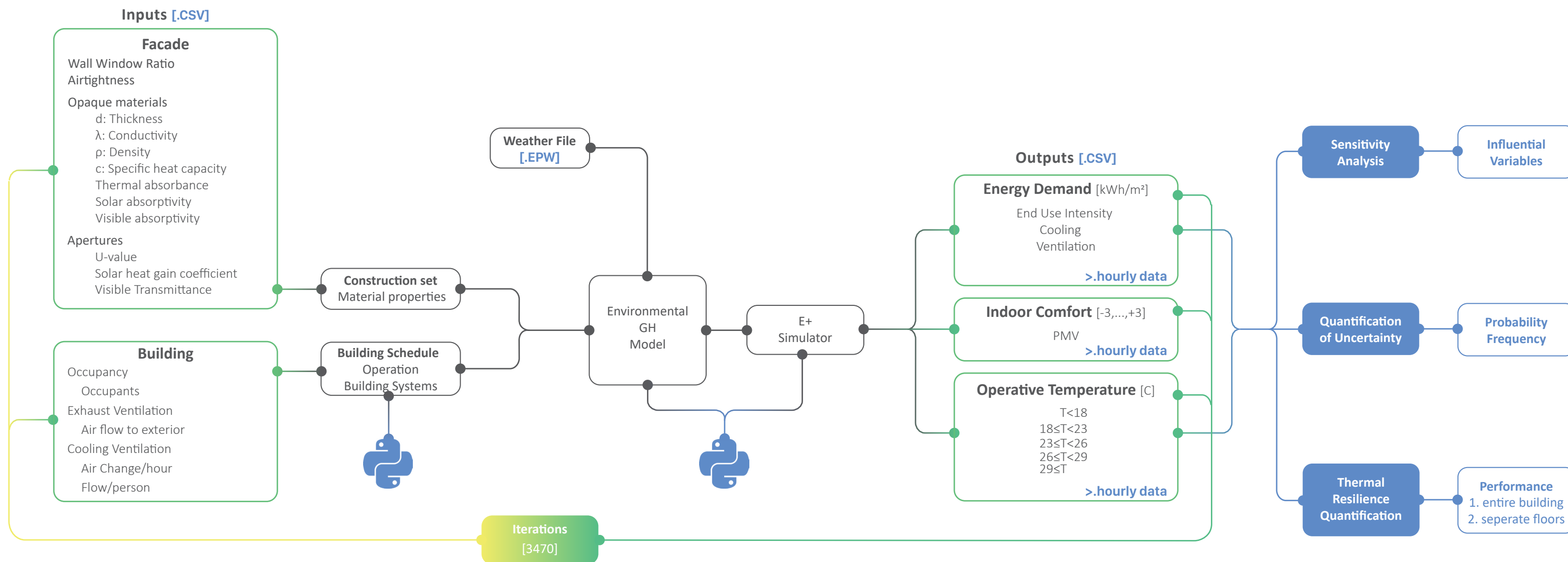
Case study set-up



Workflow



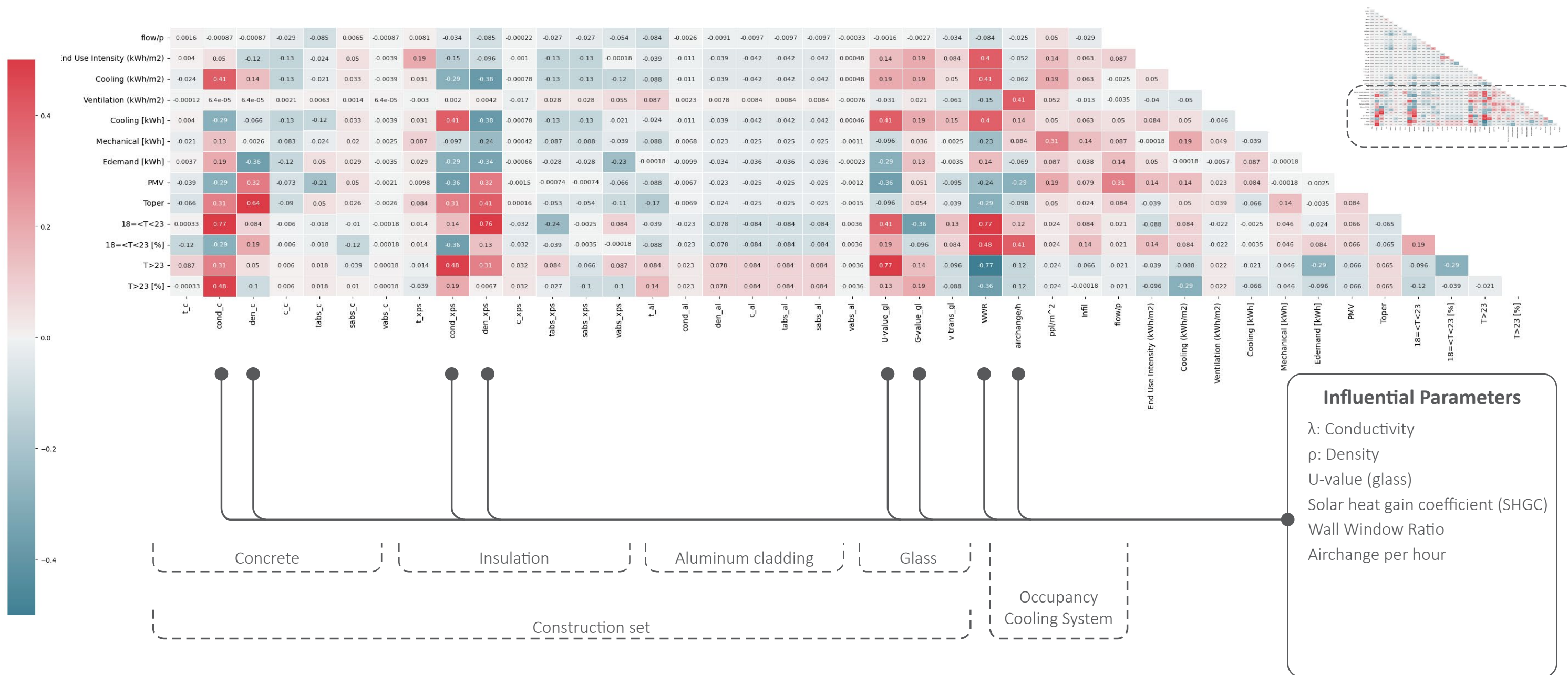
Overview of the simulation model



Core of the GH model



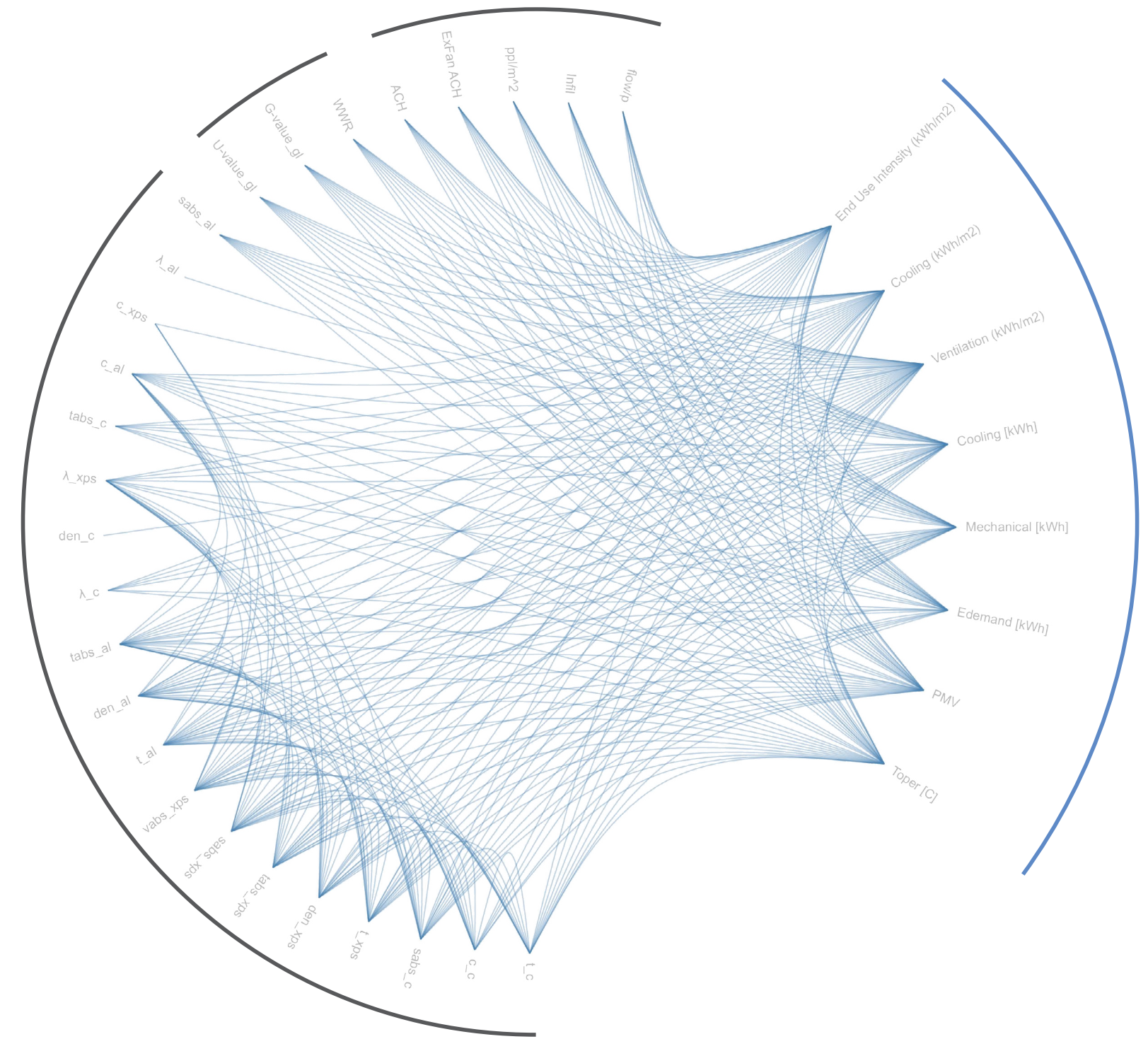
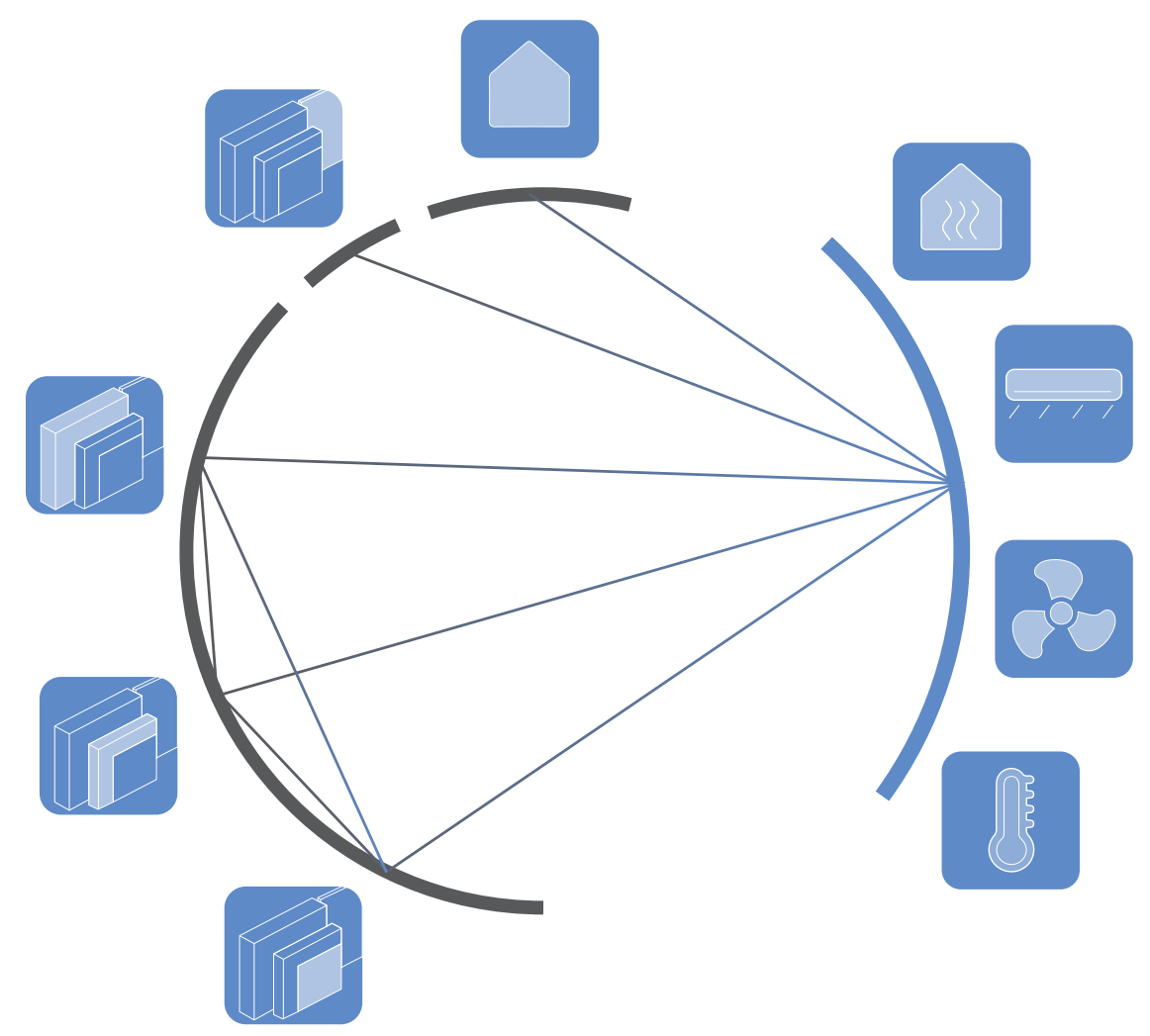
Simulation Results



Correlation matrix



Simulation Results



Inter-relationships among problem variables

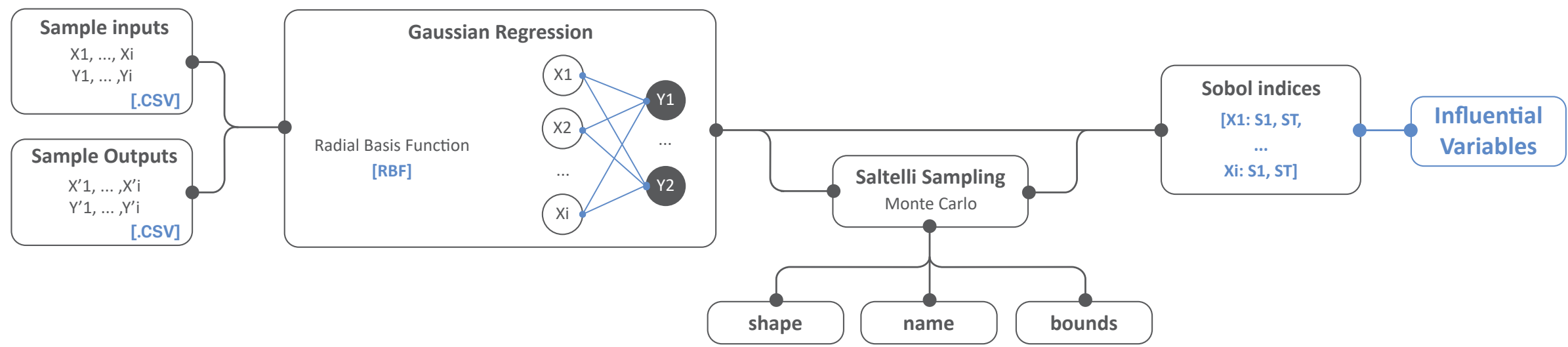


Sensitivity Analysis workflow

| | | t_c | cond_c | den_c | c_c | tabs_c | sabs_c | vabs_c | t_xps | cond_xps | den_xps | c_xps | tabs_xps | sabs_xps | vabs_xps | t_al | cond_al | den_al | c_al | tabs_al | sabs_al | vabs_al | U-value | g-value | Vtrans | WWR | ACH | EXVH | ppl/m ² | Infil | flow/p | |
|-------------------------|-----------------------|-------|--------|-------|-------|--------|--------|--------|-------|----------|---------|-------|----------|----------|----------|-------|---------|--------|-------|---------|---------|---------|---------|---------|--------|-------|-------|-------|--------------------|-------|--------|-------|
| EUI | [kWh/m ²] | -0.05 | 0.22 | 0.24 | 0.15 | 0.03 | 0.09 | -0.01 | -0.17 | 0.02 | -0.24 | -0.14 | 0.02 | 0.01 | 0.01 | 0.03 | 0.01 | 0.01 | 0.01 | 0.01 | 0.01 | 0.01 | 0.00 | 0.65 | 0.73 | 0.54 | 0.84 | 0.72 | 0.12 | 0.18 | 0.11 | 0.14 |
| Cooling | [kWh/m ²] | -0.01 | -0.17 | 0.19 | 0.05 | -0.02 | 0.02 | 0.02 | 0.22 | 0.13 | 0.22 | -0.16 | 0.01 | 0.01 | 0.01 | 0.01 | -0.02 | -0.04 | 0.03 | 0.00 | 0.01 | 0.00 | 0.00 | 0.52 | 0.89 | 0.71 | -0.78 | -0.86 | -0.09 | -0.16 | 0.06 | 0.16 |
| Mech Vent | [kWh/m ²] | 0.03 | 0.12 | -0.23 | 0.02 | -0.03 | -0.04 | 0.06 | 0.15 | -0.14 | -0.26 | 0.18 | -0.03 | -0.01 | -0.05 | 0.01 | -0.01 | -0.03 | 0.00 | -0.01 | -0.01 | 0.01 | 0.01 | -0.25 | 0.35 | -0.43 | -0.57 | 0.14 | 0.25 | -0.23 | 0.08 | -0.31 |
| Cooling | [kWh] | 0.15 | -0.21 | -0.17 | -0.03 | 0.02 | -0.02 | -0.04 | -0.16 | 0.06 | 0.25 | -0.12 | 0.01 | 0.03 | -0.01 | -0.01 | 0.03 | 0.02 | -0.02 | -0.02 | -0.01 | 0.01 | 0.01 | -0.58 | -0.91 | 0.77 | 0.72 | 0.82 | -0.05 | -0.26 | -0.07 | 0.13 |
| Mech Vent | [kWh] | -0.05 | 0.16 | -0.28 | -0.01 | 0.01 | 0.04 | 0.03 | 0.19 | -0.07 | 0.14 | 0.24 | 0.01 | 0.04 | -0.04 | -0.03 | 0.03 | -0.01 | -0.01 | 0.03 | -0.01 | -0.01 | 0.00 | 0.27 | -0.32 | -0.38 | 0.51 | -0.20 | -0.34 | 0.15 | 0.12 | -0.41 |
| Edemand | [kWh] | 0.12 | -0.19 | -0.16 | 0.05 | 0.01 | -0.03 | -0.01 | 0.10 | -0.05 | -0.17 | 0.11 | 0.03 | -0.06 | 0.01 | 0.01 | -0.02 | 0.01 | -0.03 | 0.00 | 0.01 | 0.00 | 0.00 | -0.68 | 0.72 | 0.58 | -0.87 | -0.71 | 0.06 | 0.24 | -0.10 | 0.25 |
| PMV | [-3,...,+3] | 0.22 | 0.41 | 0.32 | 0.15 | 0.00 | 0.03 | 0.01 | 0.33 | 0.08 | -0.39 | -0.41 | -0.04 | 0.01 | 0.01 | 0.02 | 0.01 | 0.06 | 0.03 | 0.01 | 0.02 | 0.01 | 0.01 | 0.49 | 0.64 | 0.43 | 0.52 | 0.48 | -0.05 | 0.28 | 0.05 | 0.02 |
| T_{oper} | [°C] | -0.13 | -0.57 | 0.45 | 0.02 | 0.06 | -0.01 | 0.06 | -0.58 | 0.01 | -0.43 | -0.46 | -0.04 | -0.03 | 0.03 | -0.01 | -0.02 | 0.04 | 0.00 | -0.01 | 0.00 | -0.02 | 0.00 | -0.78 | -0.89 | -0.64 | -0.95 | 0.82 | 0.03 | -0.16 | 0.03 | -0.14 |

Total-order highest score

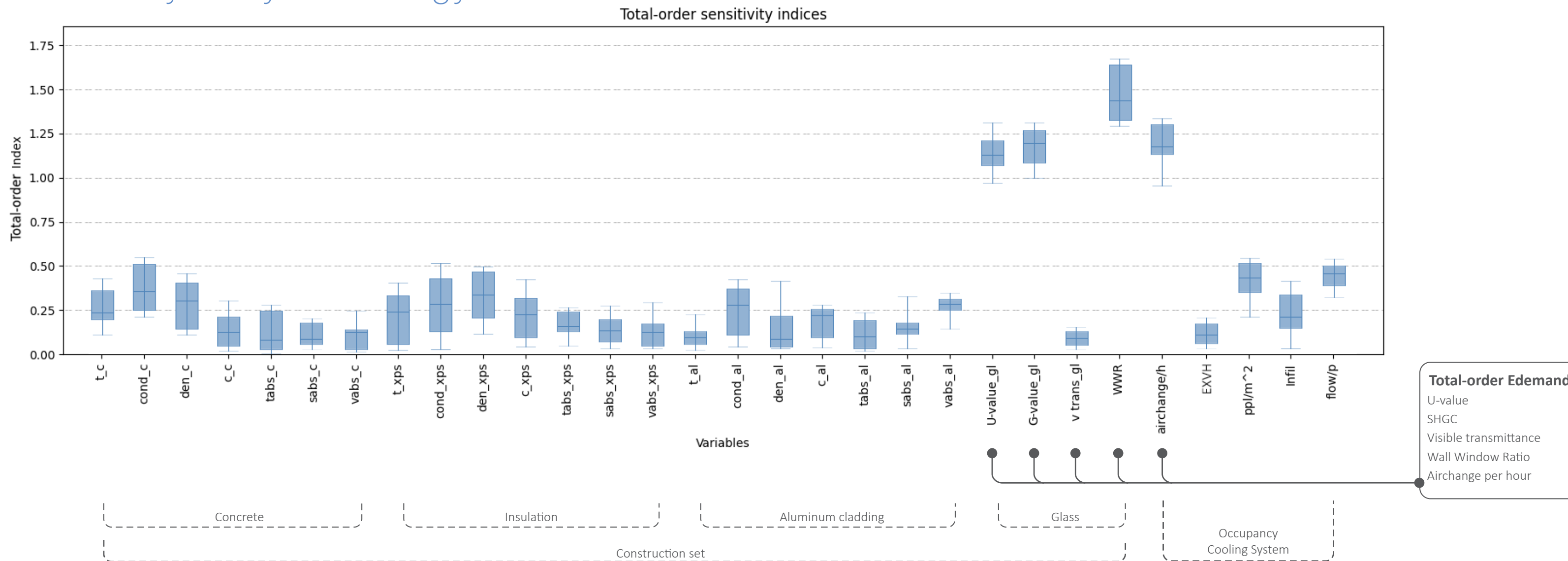
λ: Conductivity (concrete)
 ρ: Density (concrete)
 t: Thickness (xps)
 Specific Heat Capacity (xps)
 U-value (glass)
 SHGC (glass)
 Visible transmittance (glass)
 Wall Window Ratio
 Airchange per hour



Post-processing



Sensitivity Analysis - Energy demand

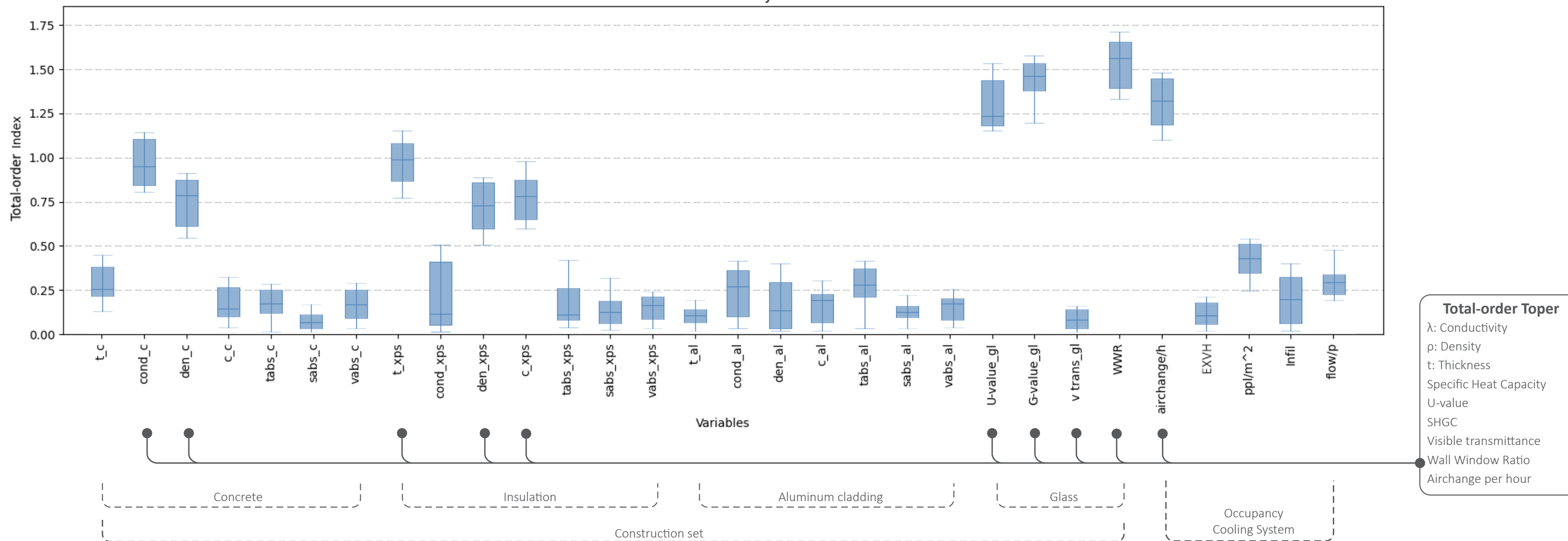


Post-processing



Sensitivity Analysis - Operative temperature

Total-order sensitivity indices

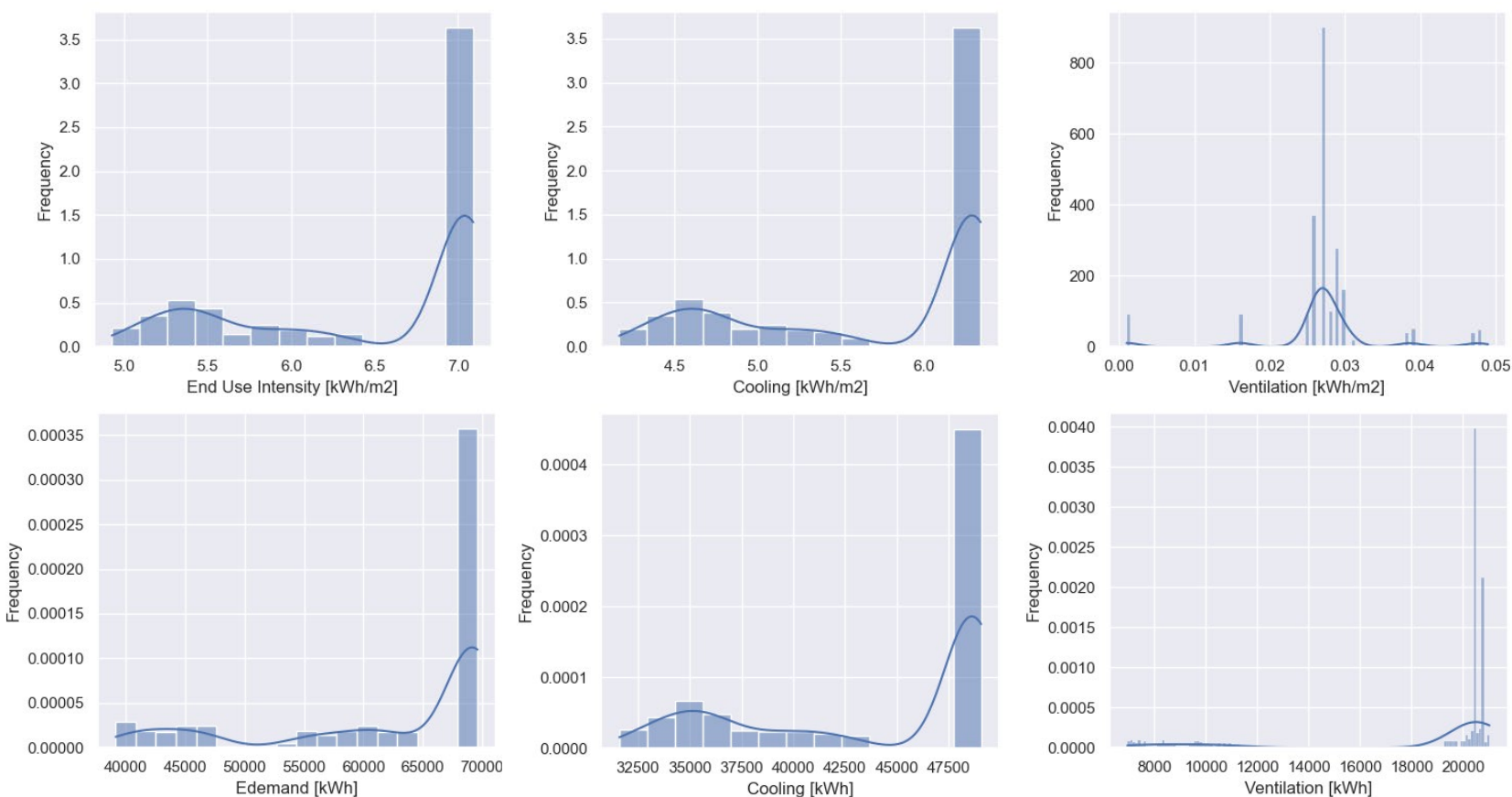


Post-processing

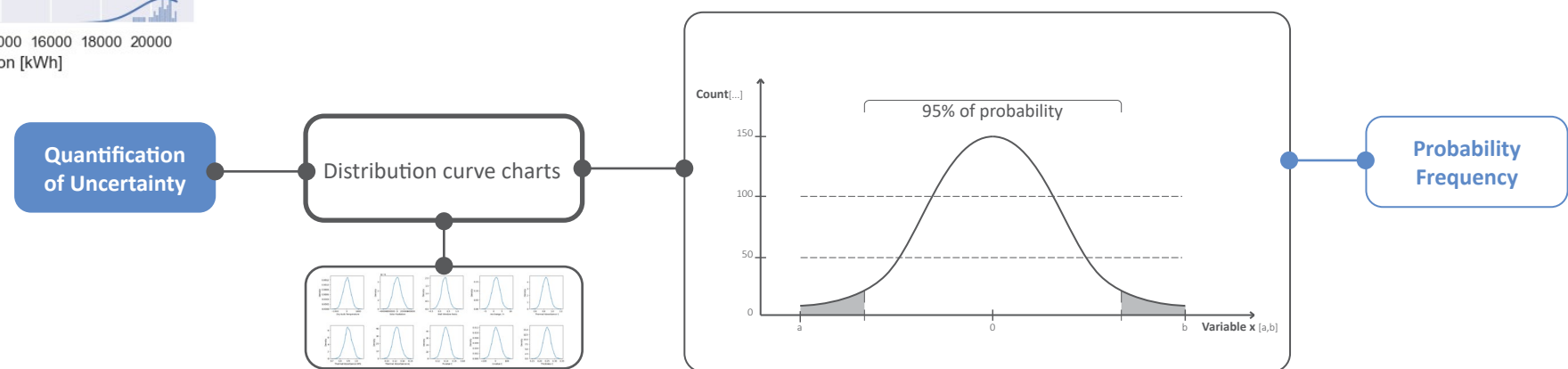
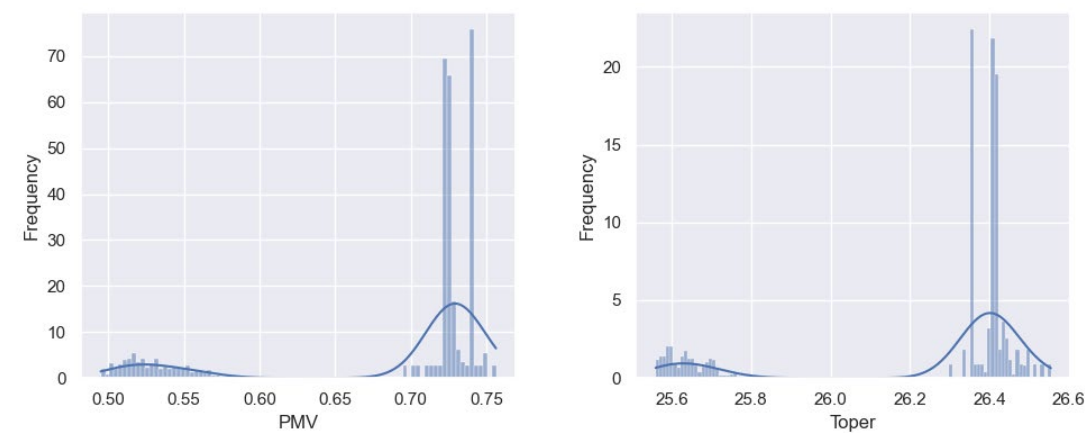


Probability of the results

Energy demand



Thermal Comfort

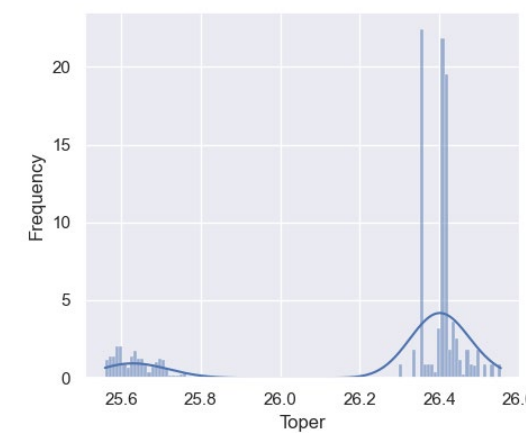
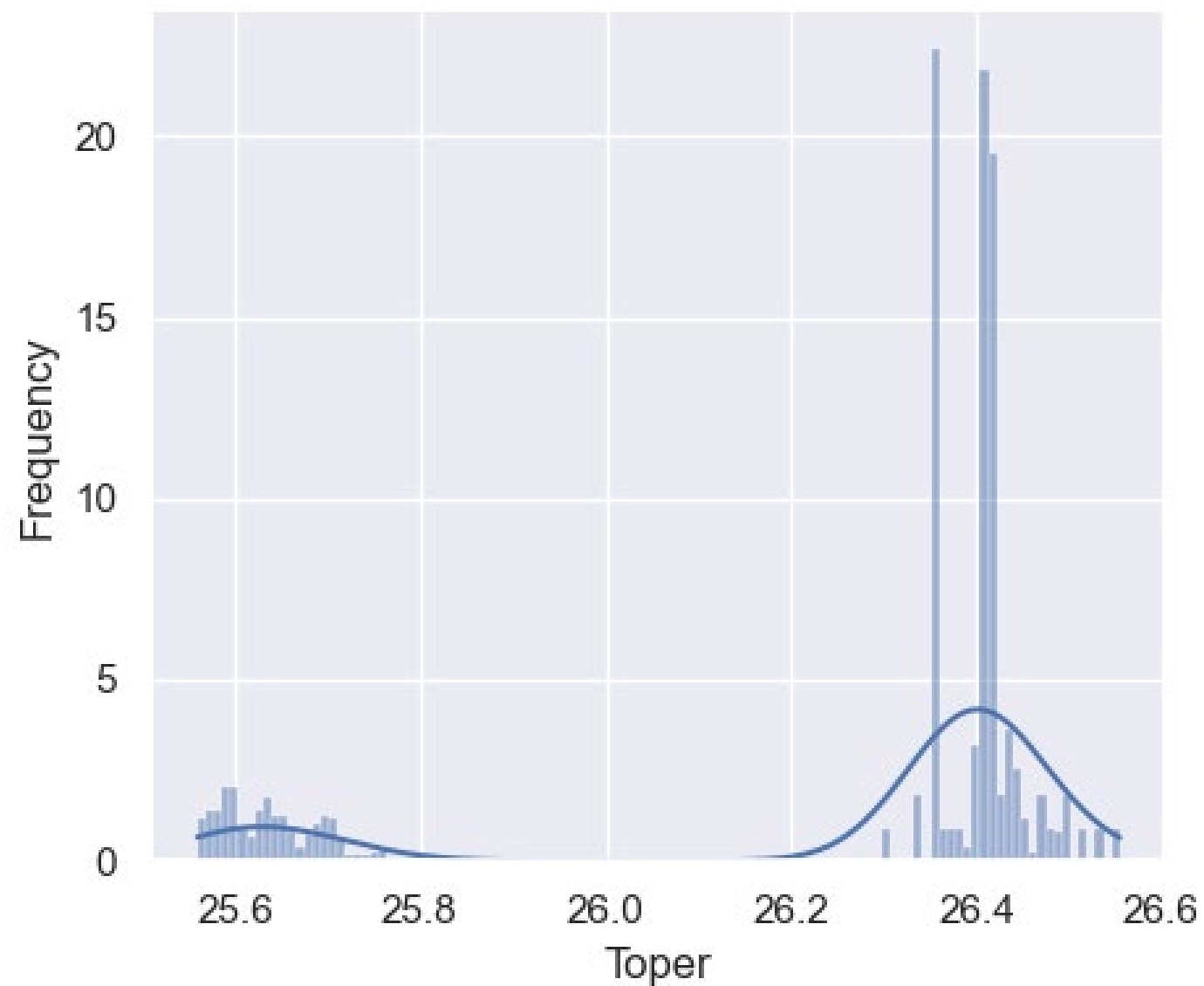


Post-processing

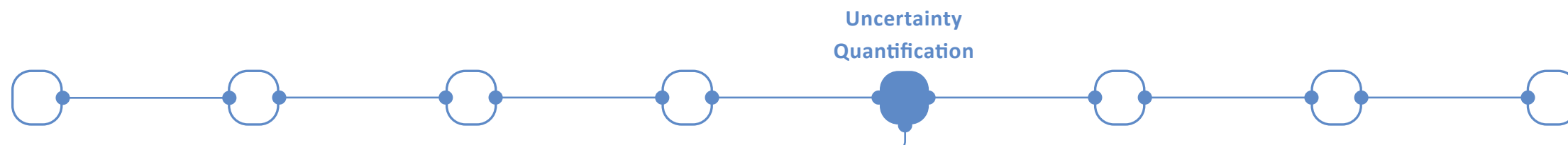


Uncertainty
Quantification

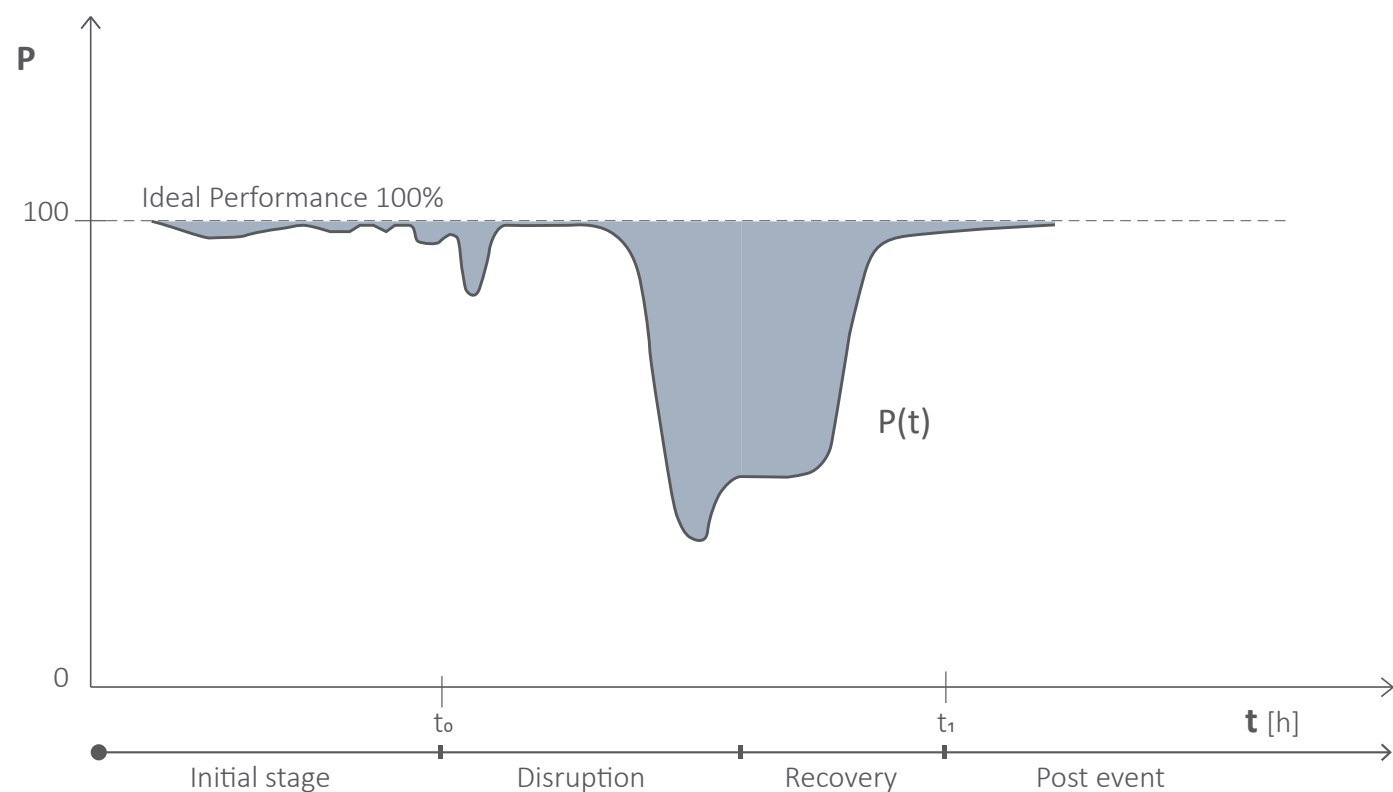
Probability of the Temperature results



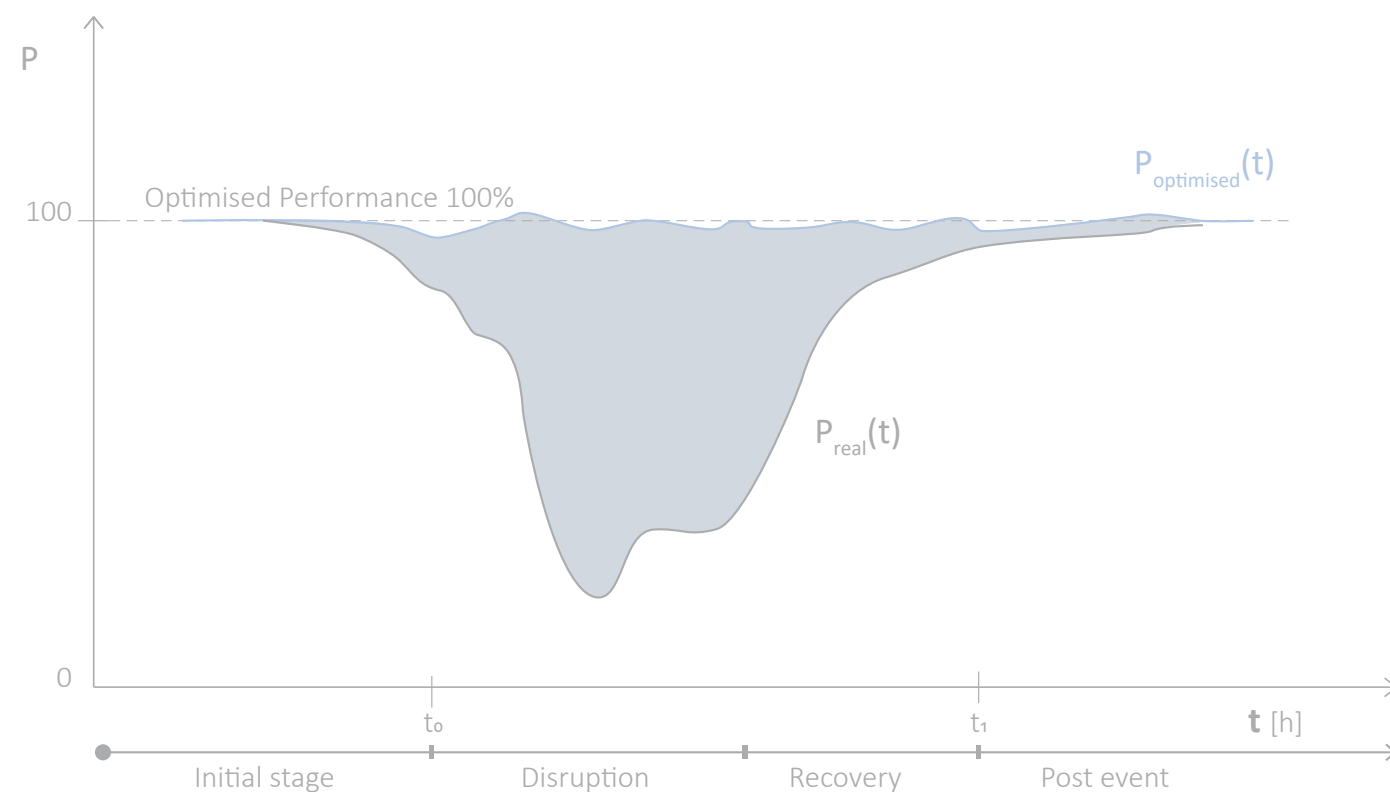
Post-processing



Thermal resilience quantification

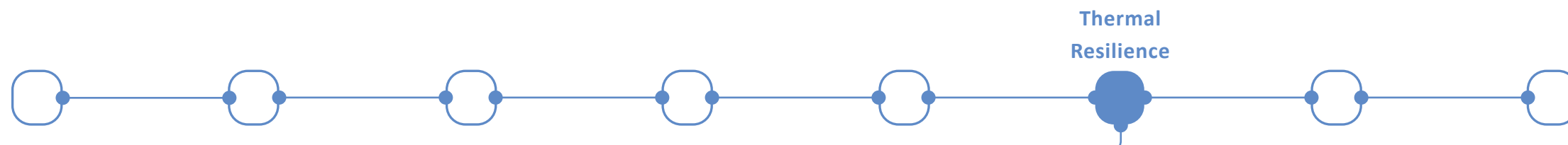


$$R_{Loss} = \int_{t_0}^{t_1} [100 - P(t)] dt$$

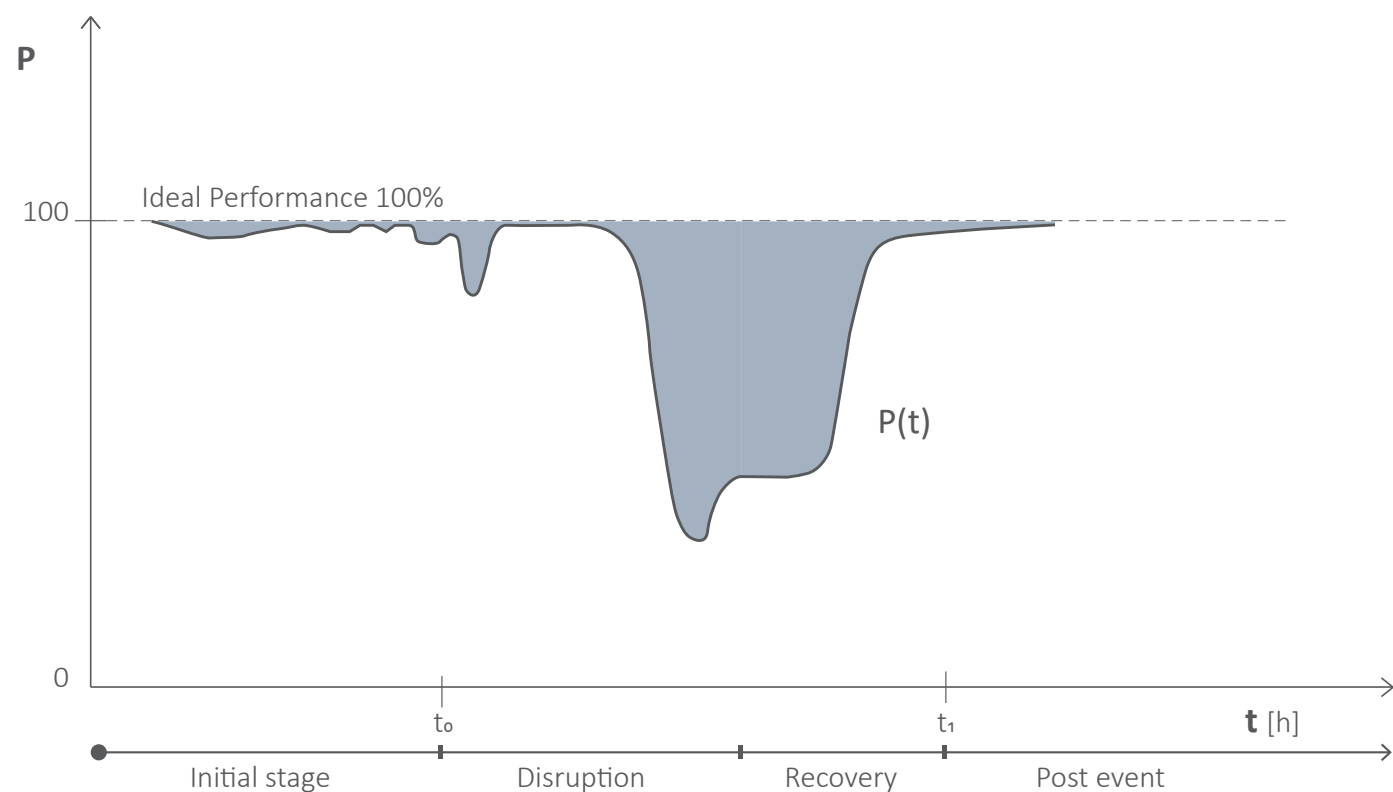


$$R_{Loss} = \int_{t_0}^{t_1} [p_{(t)}^{optimised} - p_{(t)}^{real}] dt$$

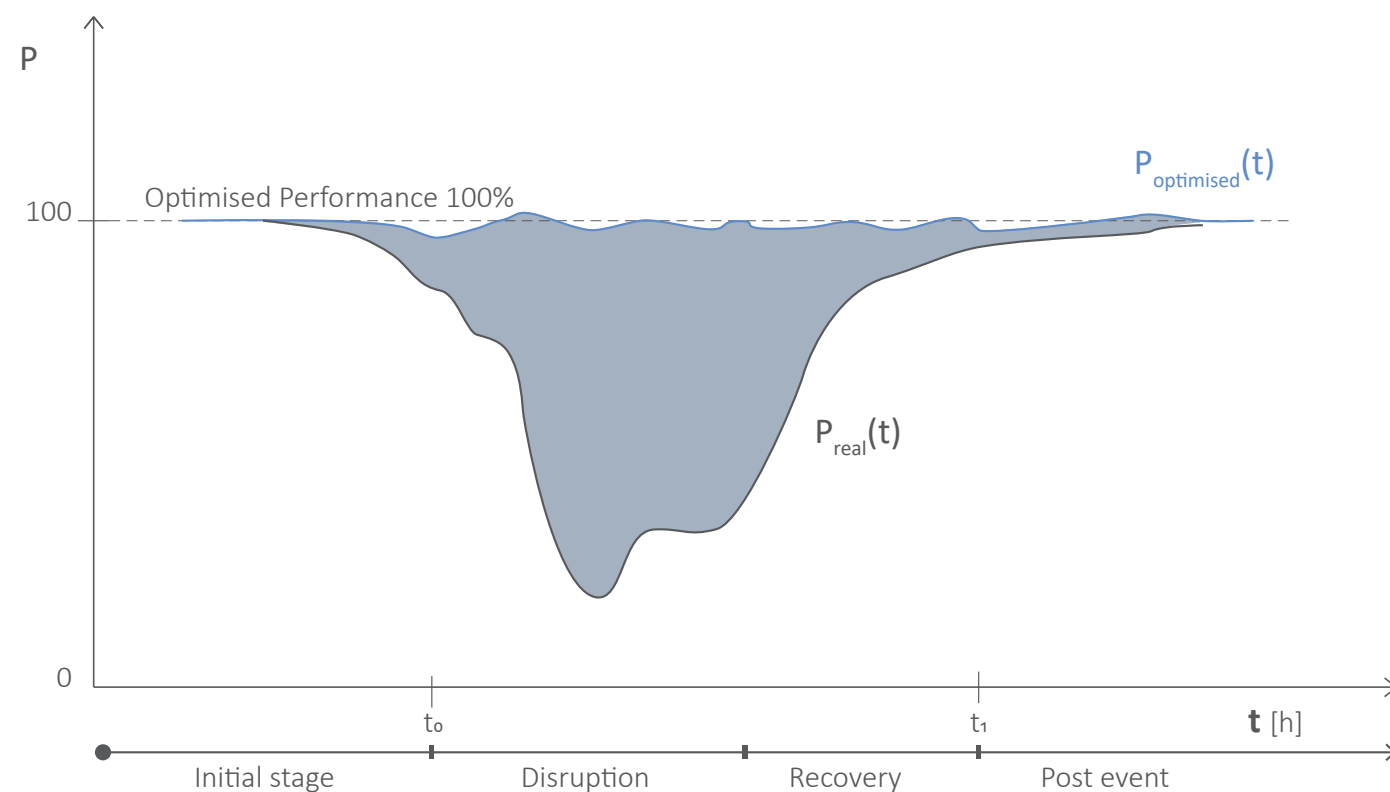
Quantification concept



Thermal resilience quantification

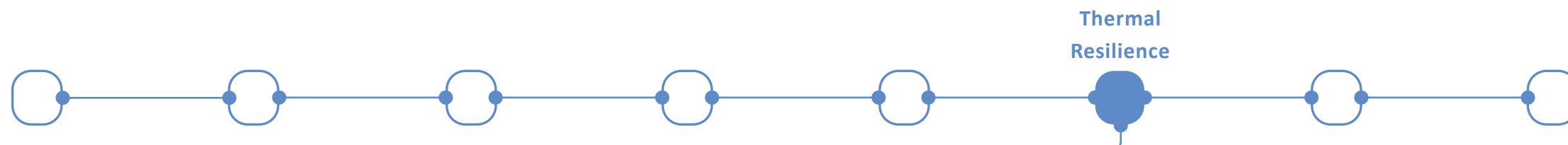


$$R_{Loss} = \int_{t_0}^{t_1} [100 - P(t)] dt$$

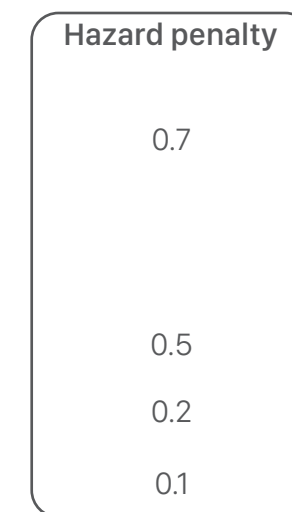
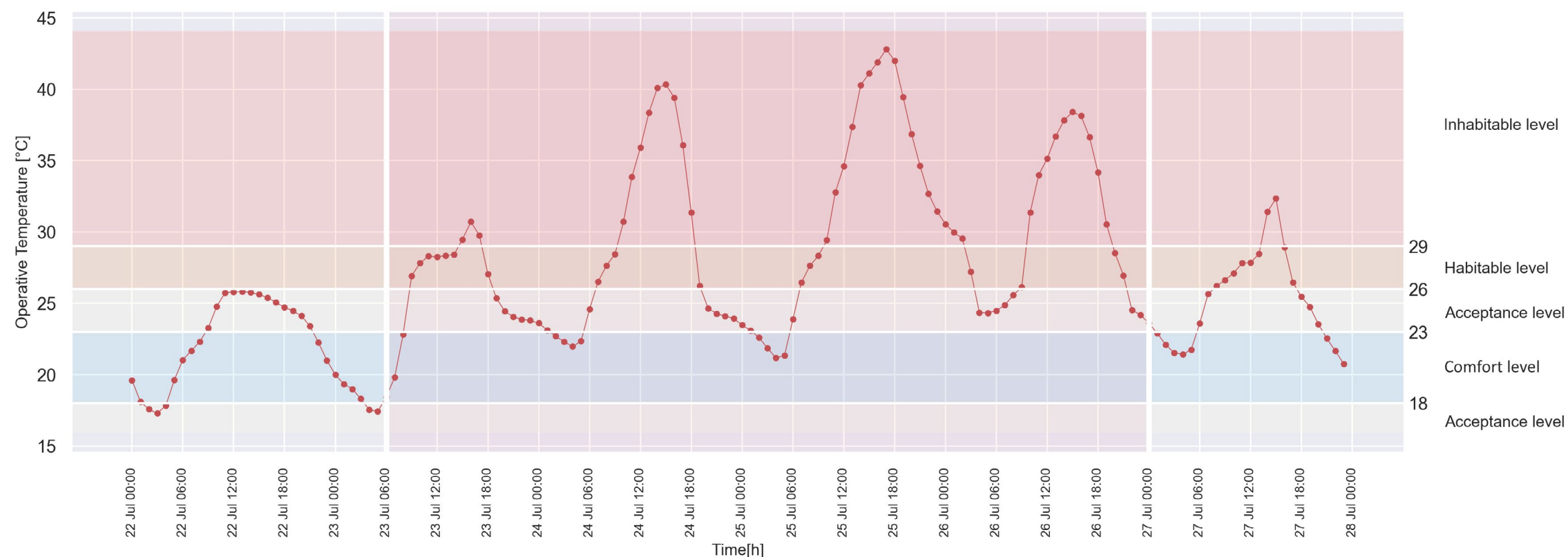


$$R_{Loss} = \int_{t_0}^{t_1} [p_{(t)}^{optimised} - p_{(t)}^{real}] dt$$

Quantification concept



Thermal resilience quantification



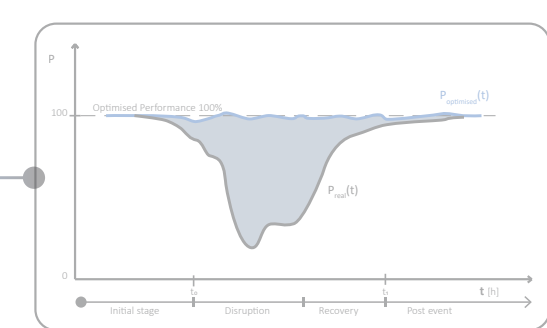
Energy Demand [kWh]
Cooling
Ventilation
[>.hourly data](#)

Operative Temperature [C]
T<18
18≤T<23
23≤T<26
26≤T<29
29≤T
[>.hourly data](#)

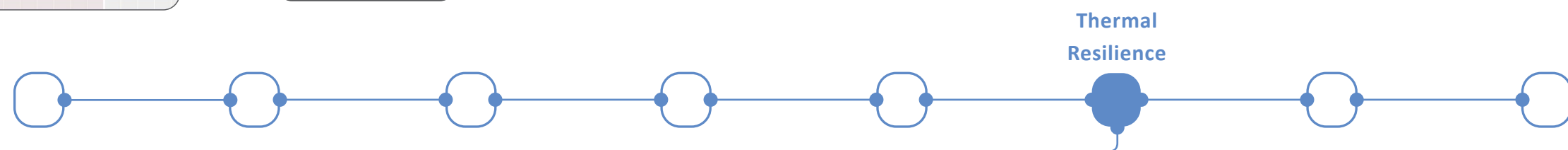
Optimised Performance
Edemand x Toper
[T≈21°C]

Building Performance
Edemand x W x Toper

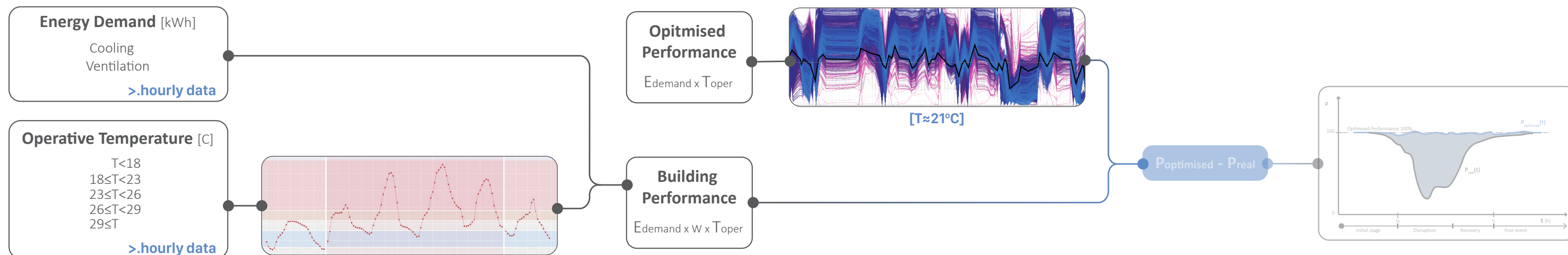
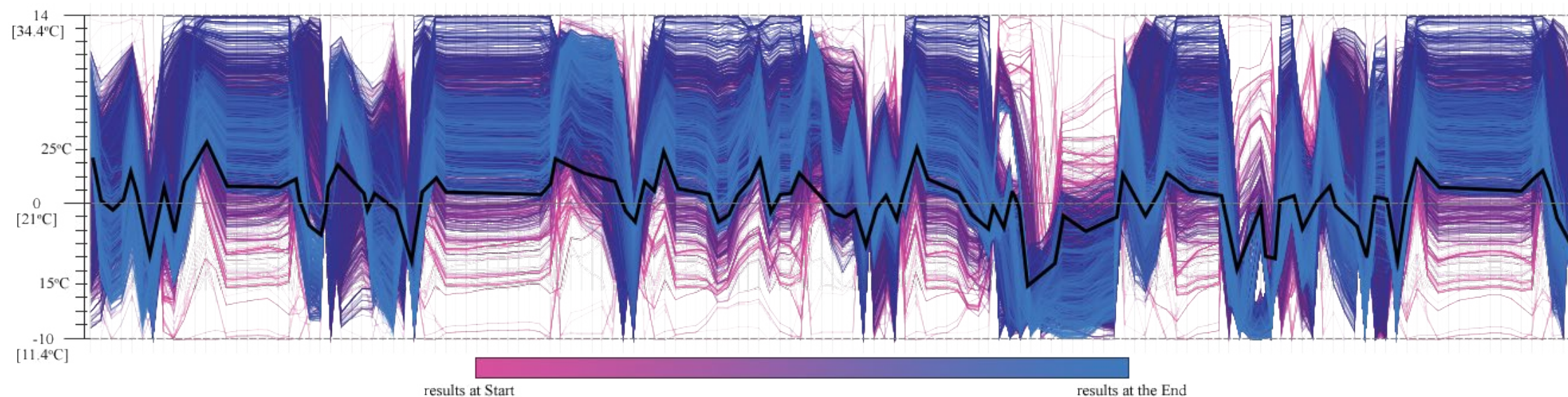
Poptimised - Preal



Classification of the temperature values



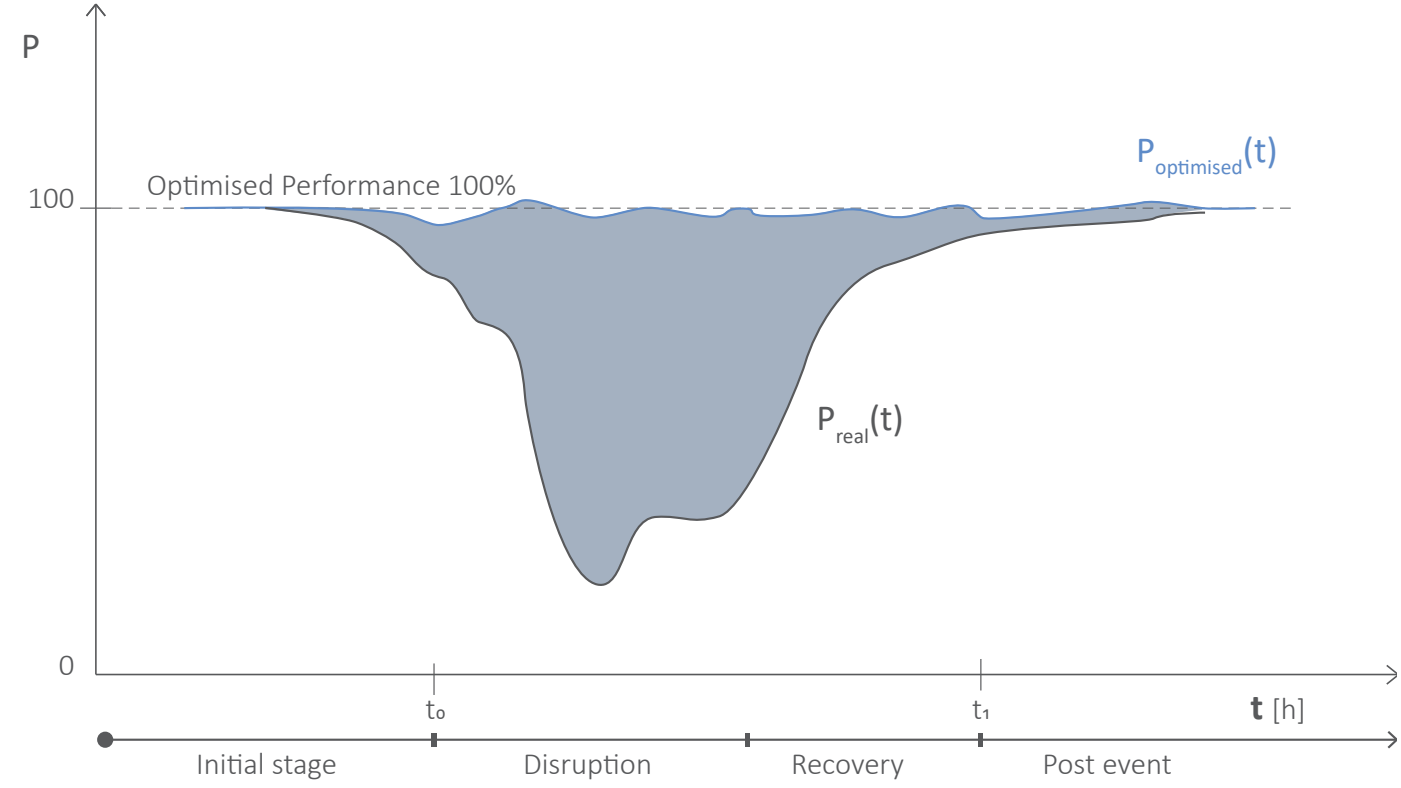
Thermal resilience quantification



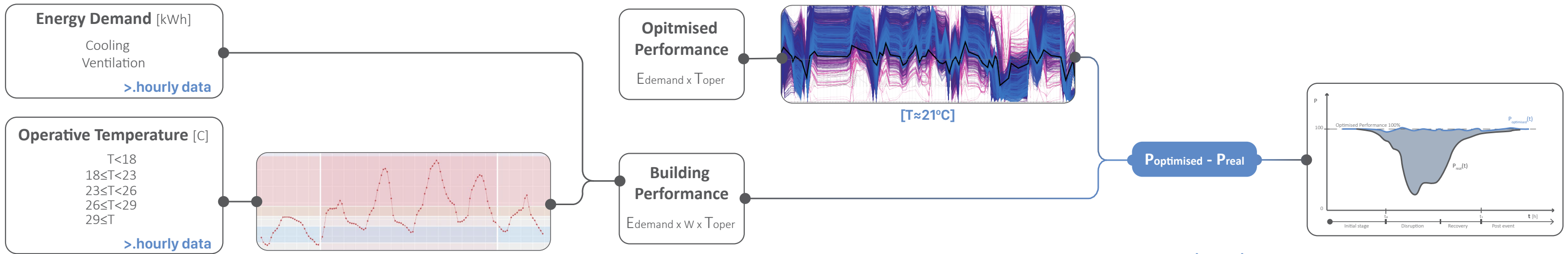
Optimisation



Thermal resilience quantification



$$R_{Loss} = \int_{t_0}^{t_1} [p_{(t)}^{\text{optimised}} - p_{(t)}^{\text{real}}] dt$$



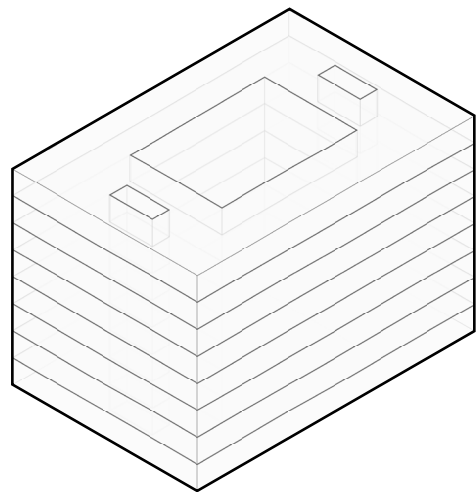
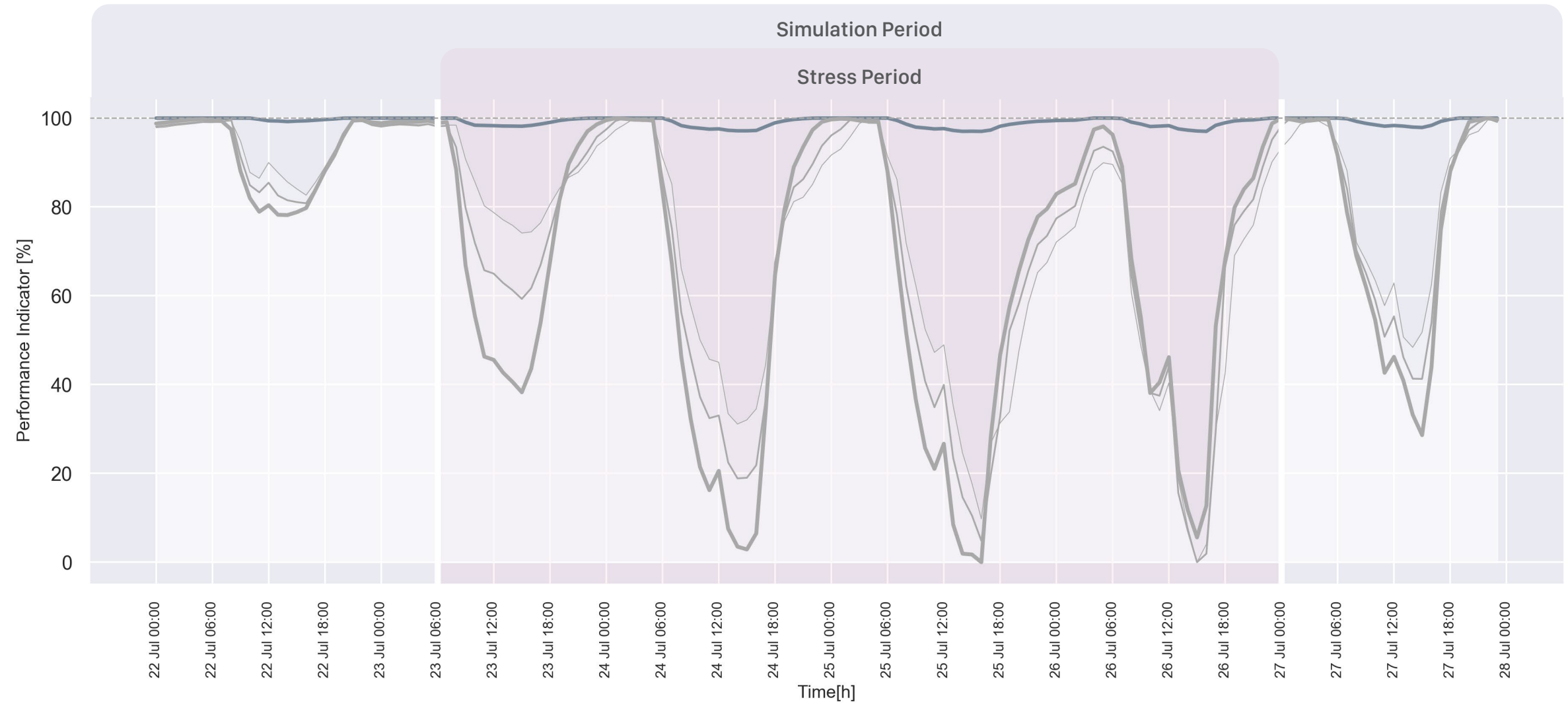
Performance curve



Thermal Resilience Performance



Thermal resilience performance: different **wall-window ratio**

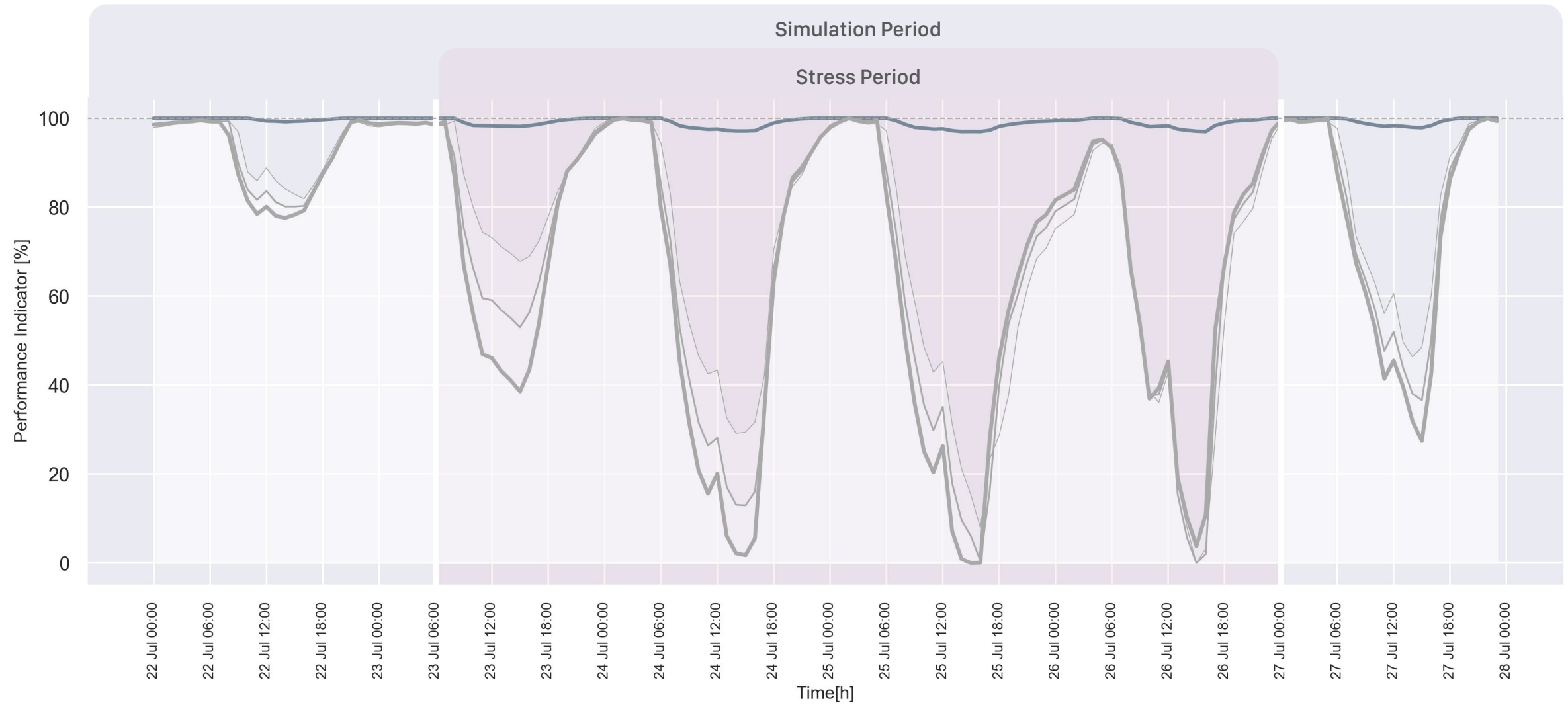
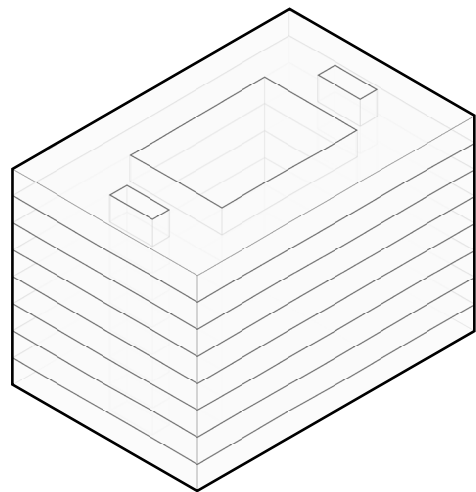


Entire building



Thermal resilience performance: different **solar-heat gain coefficient** (G-value)

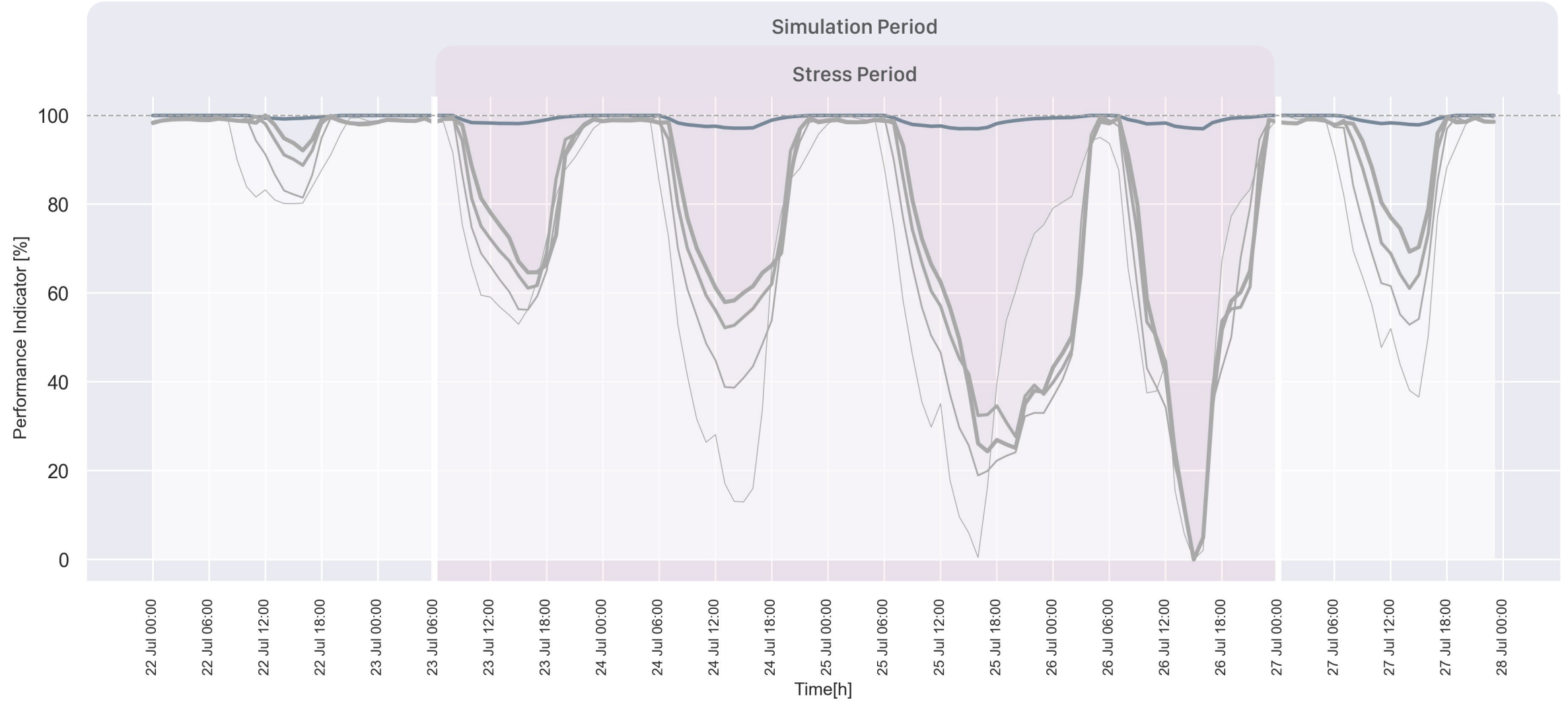
- Optimised scenario
- SHGC 0.30: R=10804.35
- SHGC 0.60: R=10357.45
- SHGC 0.90: R=10049.14



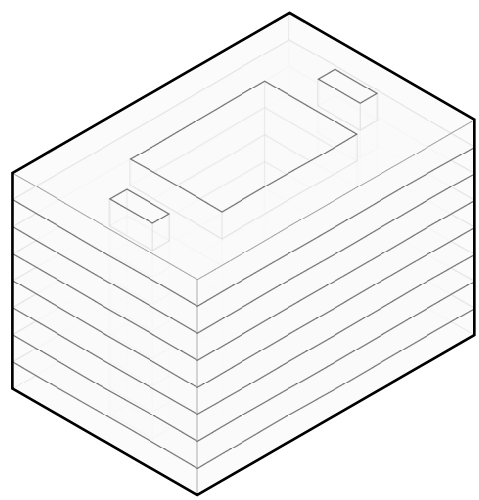
Entire building



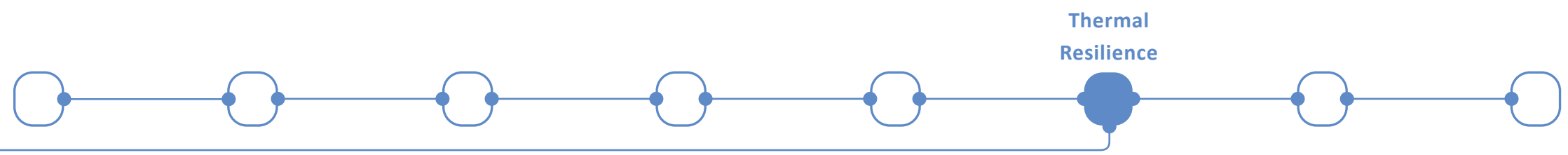
Thermal resilience performance: different **air change/h** (ACH)



- Optimised scenario
- ACH 0.01: R=10356.97
- ACH 1.50: R=10746.15
- ACH 2.50: R=11309.80
- ACH 3.50: R=11494.85

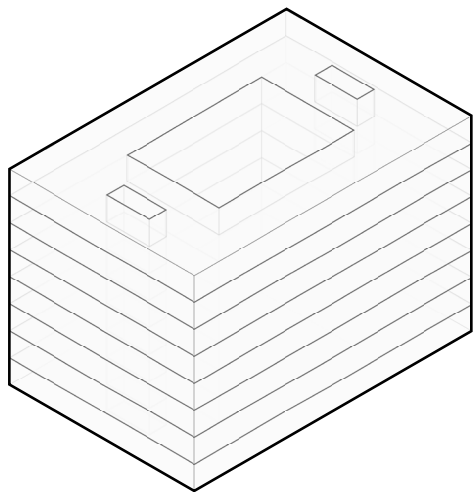
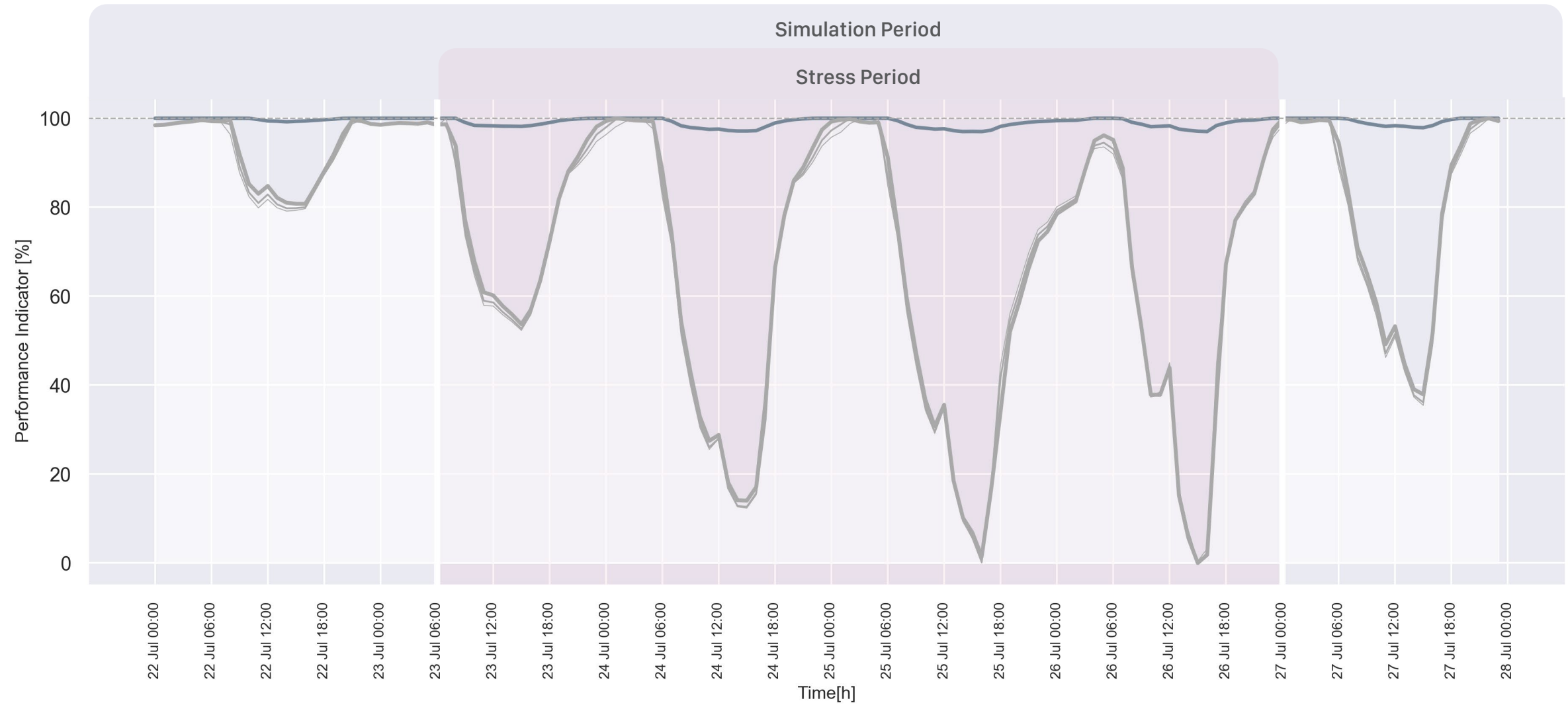


Entire building



Thermal resilience performance: different glazing **thermal transmittance** (U-value)

- Optimised scenario
- Uv_glass 0.70: R=10278.99
- Uv_glass 1.30: R=10321.24
- Uv_glass 2.40: R=10429.71

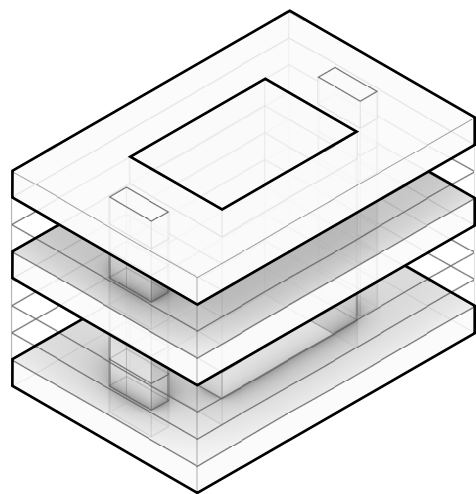
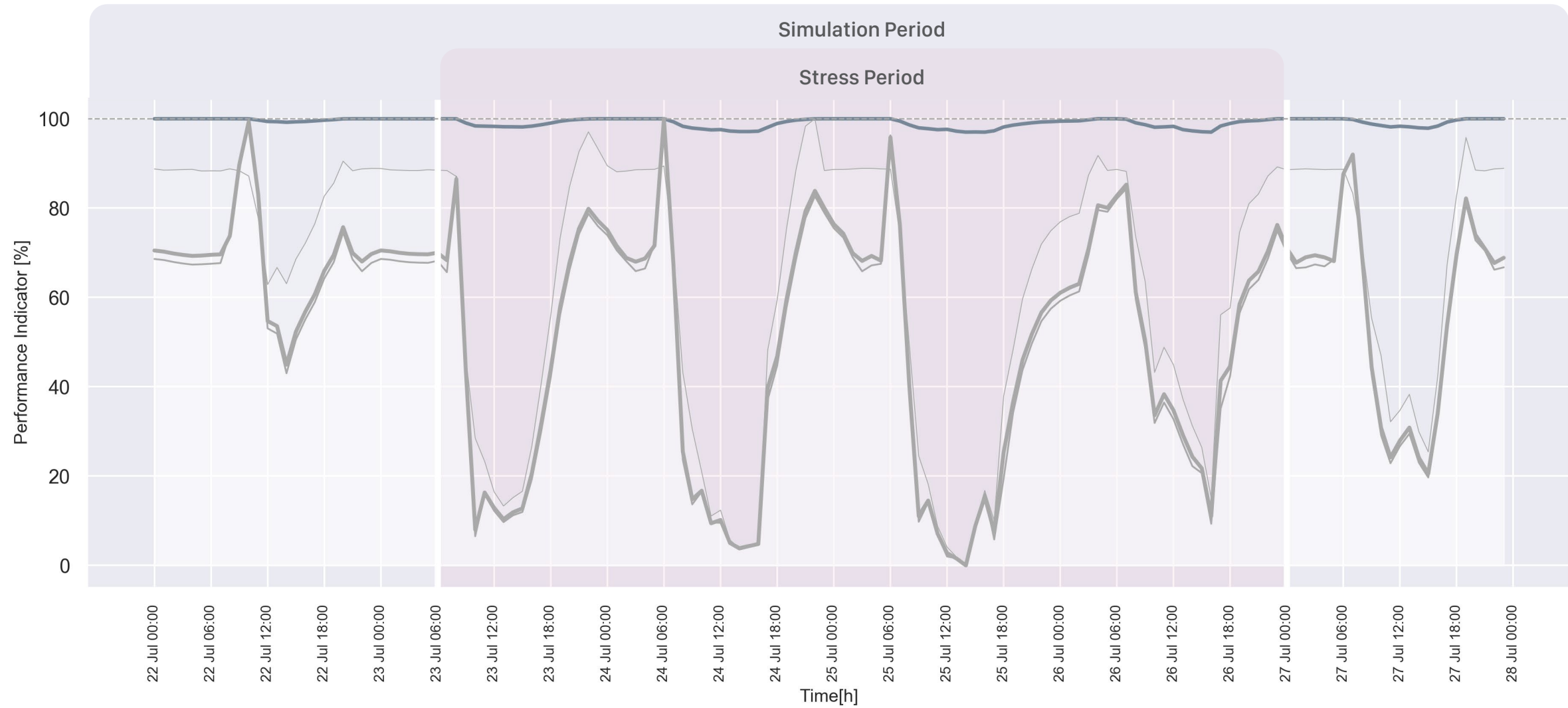


Entire building



Thermal resilience performance: floor comparison

- Optimised scenario
- Ground floor: R=9272.58
- 4th floor: R=7423.77
- 8th floor: R=7617.83

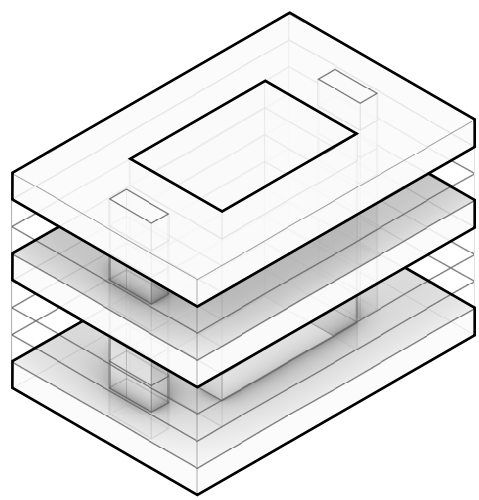
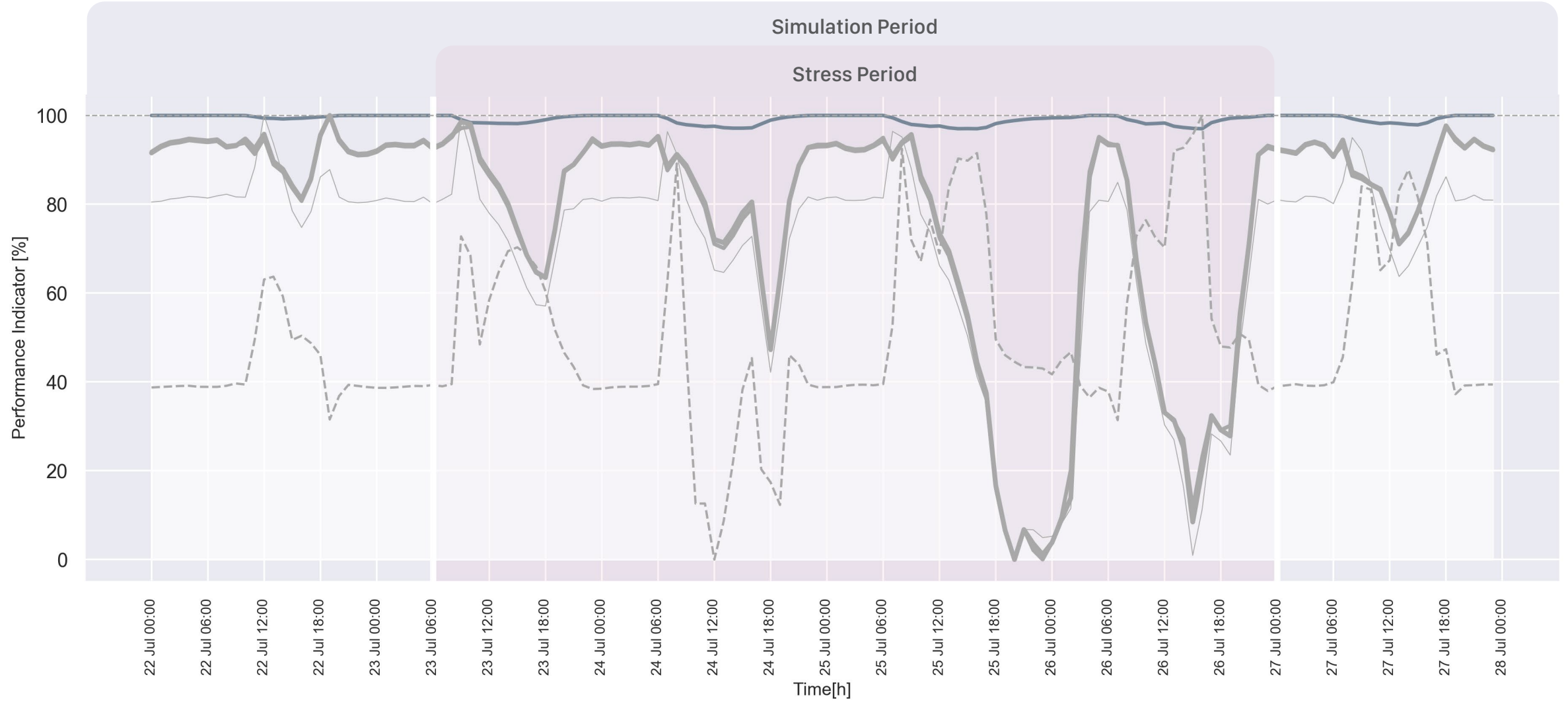


Results per thermal zone

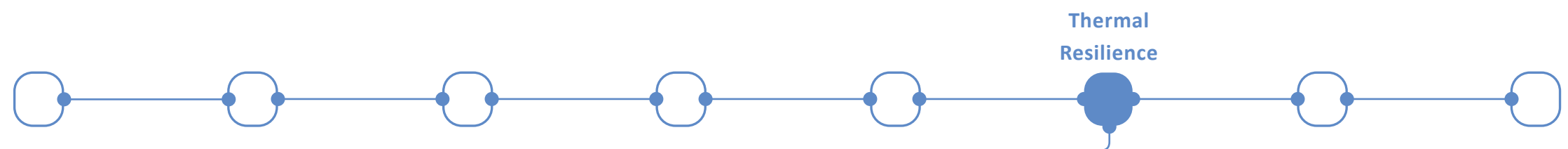


Thermal resilience performance: floor - atrium comparison

- Optimised scenario
- - - Atrium: R=7129.65
- Ground floor: R=9900.53
- 4th floor: R=11021.62
- 8th floor: R=11019.48

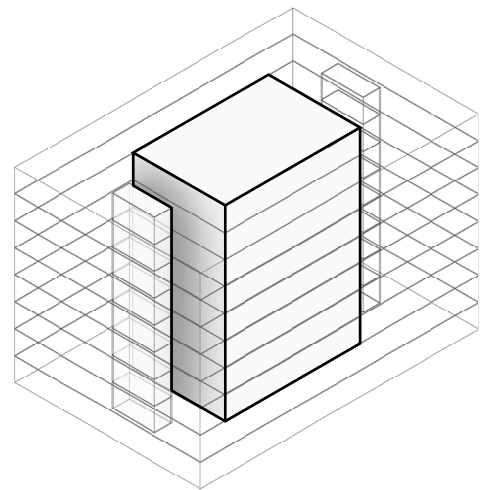
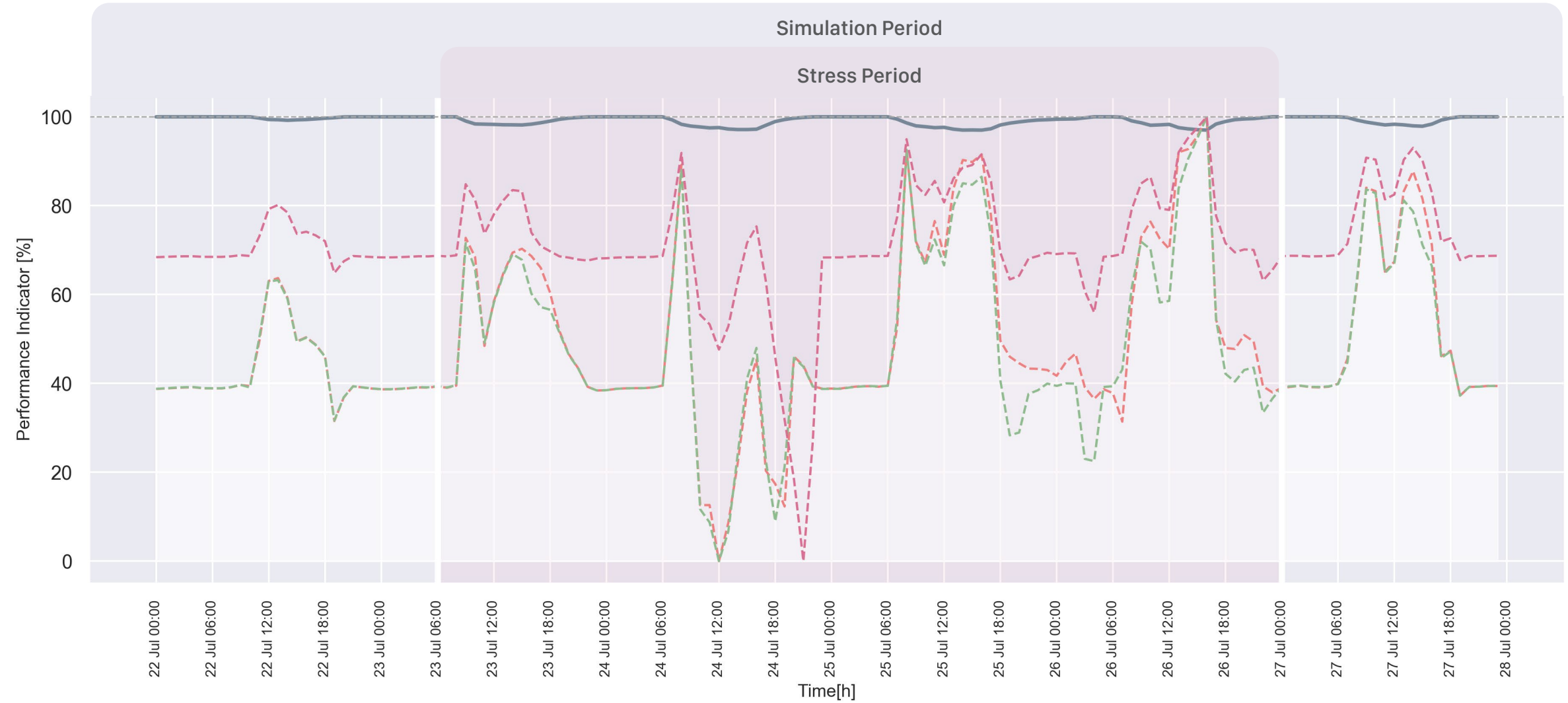


Results per thermal zone



Thermal resilience performance: different **ACH in atrium**

- Optimised scenario
- - - ACH 1.50: R=7129.65
- - - ACH 2.50: R=6885.08
- - - ACH 5.00: R=10223.28



Results per thermal zone

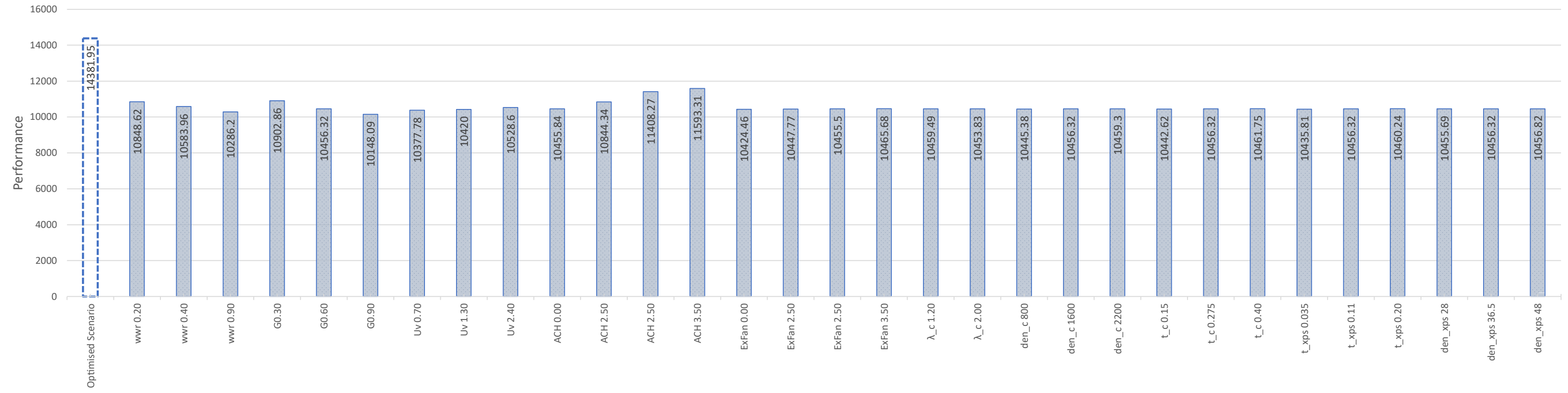


Conclusion & Discussion



Influential parameters

Building Performance for different case scenarios



Variant building and material properties



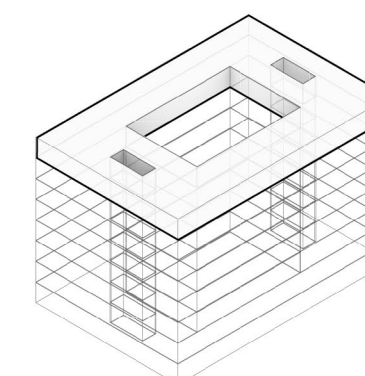
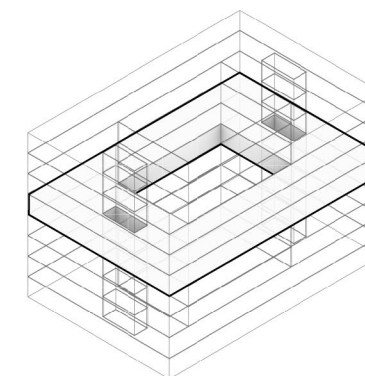
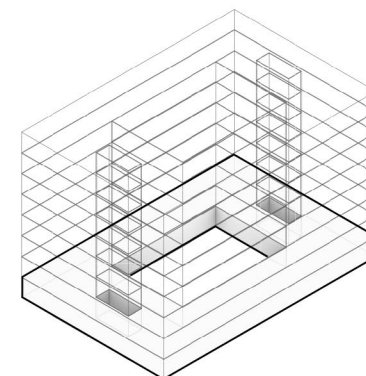
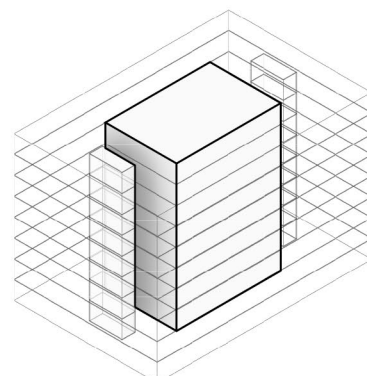
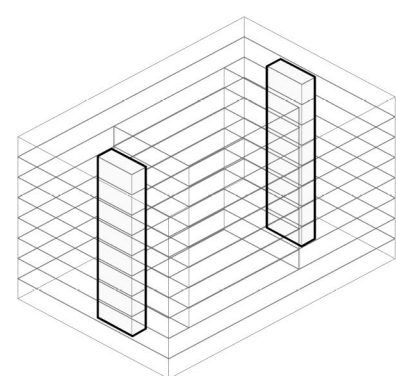
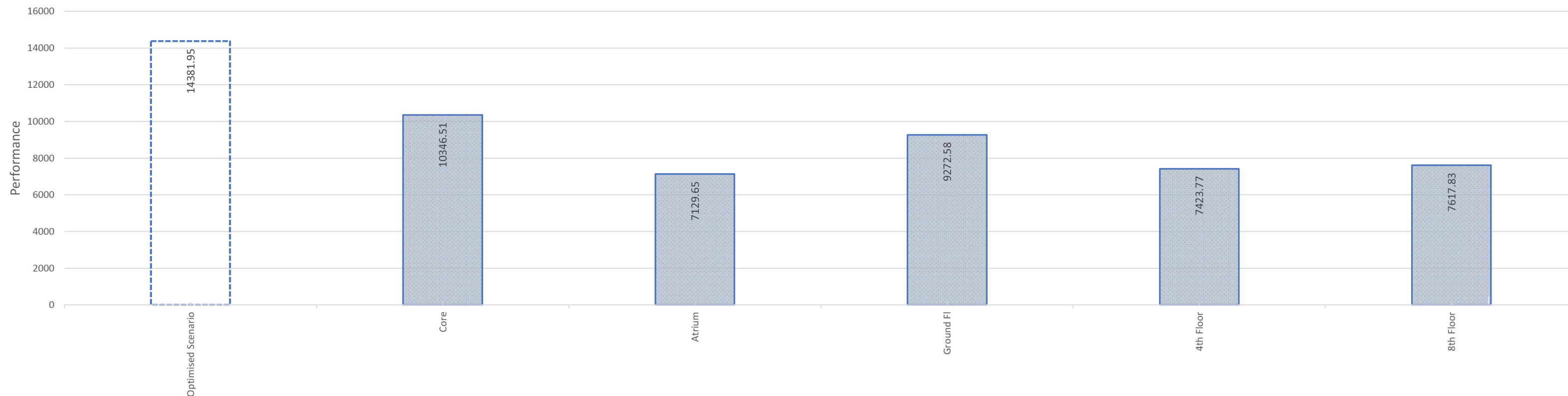
Case study outcomes



Conclusion Discussion

Thermal Zone Comparison

Building performance: thermal zone comparison



Conclusion
Discussion

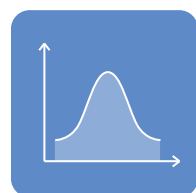
Case study outcomes



Discussion



Large data handling and deep knowledge of **climate modeling**



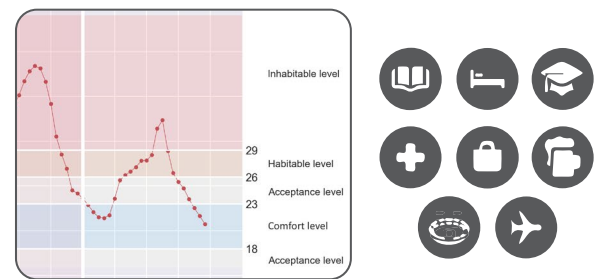
Time-consuming and high computational **cost** process



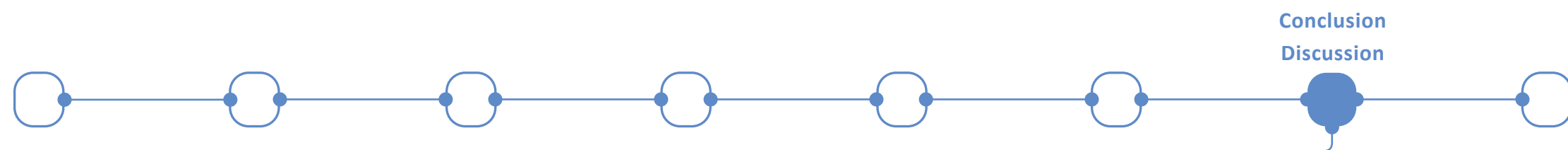
Levels of comfort can vary for different **building types**



Multidisciplinary research that engages the fields of building, climate, computer sciences



Research insights



Further Development



Suggestions for Further development



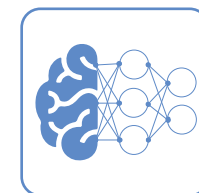
Labelling buildings according to their Resilience Class



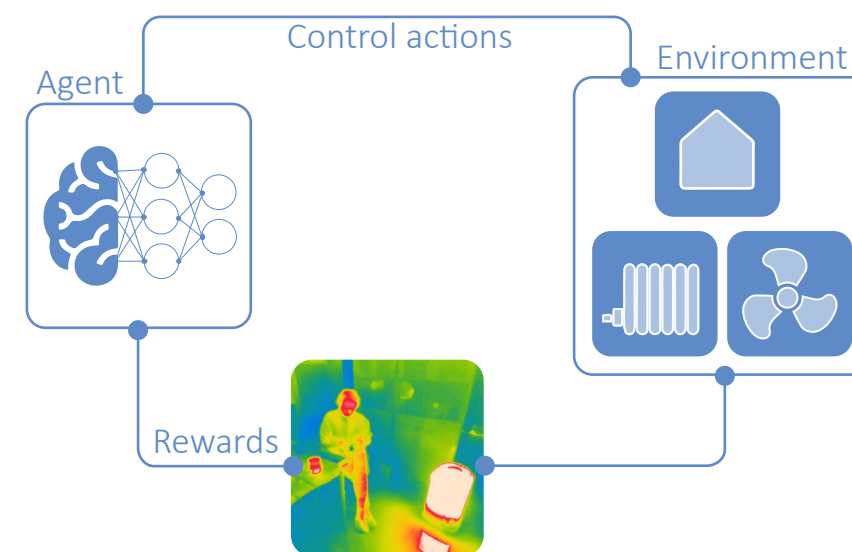
Entire building simulation with **eppy** library



Expand to the **urban scale** Urban Heat Islands



Implementation of **RL** and CNN in existing buildings



Thank you!



June 2023