

Hello!









Pulse Building – TU Delft



"It's cold especially near the glass. Surprisingly, the areas far from the glass are also cold, even inside the classroom is cold."
Aprisia, Indonesian.



"Pulse gets cold during the winter, especially seating on the last floor near the glass."
Mohammed, Ethiopian.



"It's always cold, I have to wear a sweater always. But it's good in summers that it's cold."
Gargi, Indian.



"I usually stay at the study area, it is cold during winter. Inside the classroom also cold"
Liu, Chinese.

Comparative Analysis of Energy Saving and Thermal Comfort in Full-Glass Façade Building: *System Modifications, Retrofitting, and Their Combination*

Alya Farah Taufiqoh

Regina Bokel (1st mentor)

Telesilla Bristogianni (2nd mentor)

Chujie Lu (3rd mentor)

Dirk Dubbeling (External delegate)

Comparative Analysis of Energy Saving and Thermal Comfort in Full-Glass Façade Building:

System Modifications, Retrofitting, and Their Combination

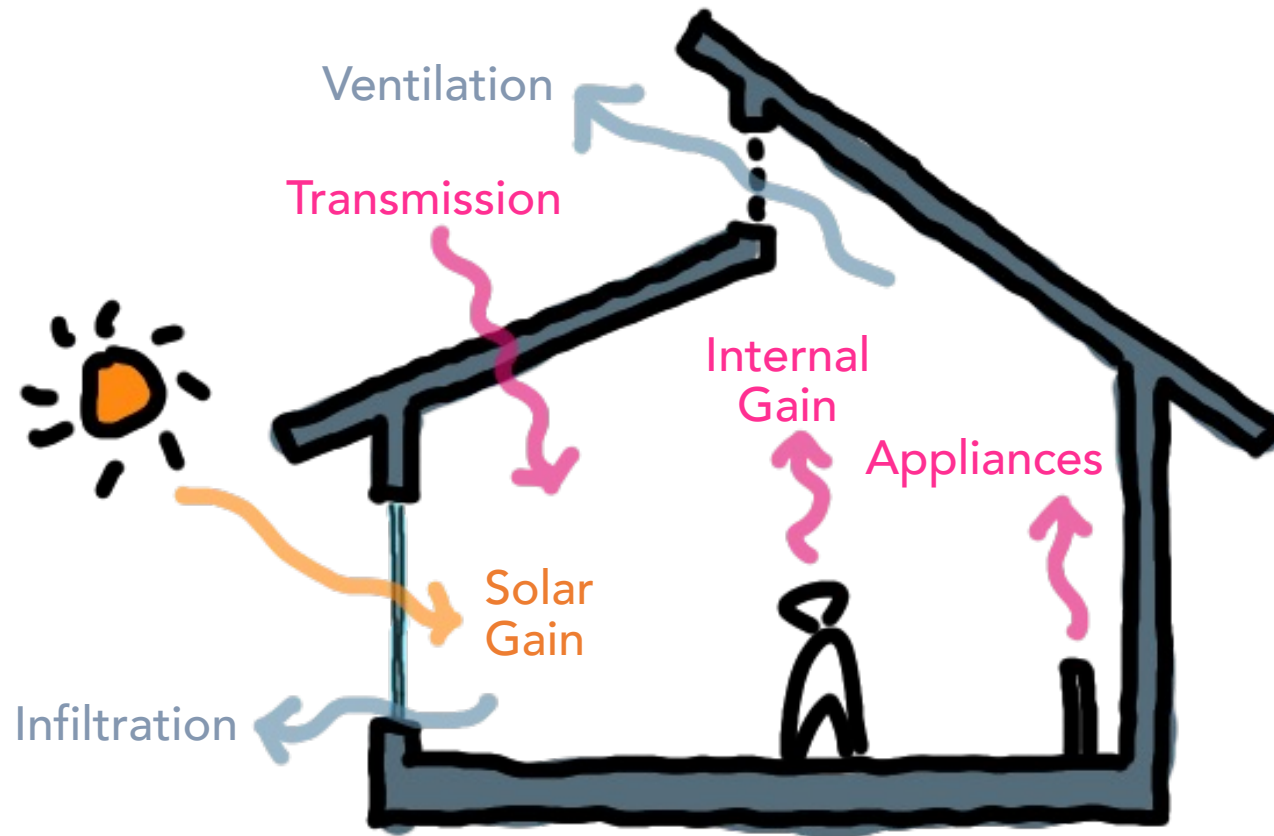
Alya Farah Taufiqoh

Regina Bokel (1st mentor)

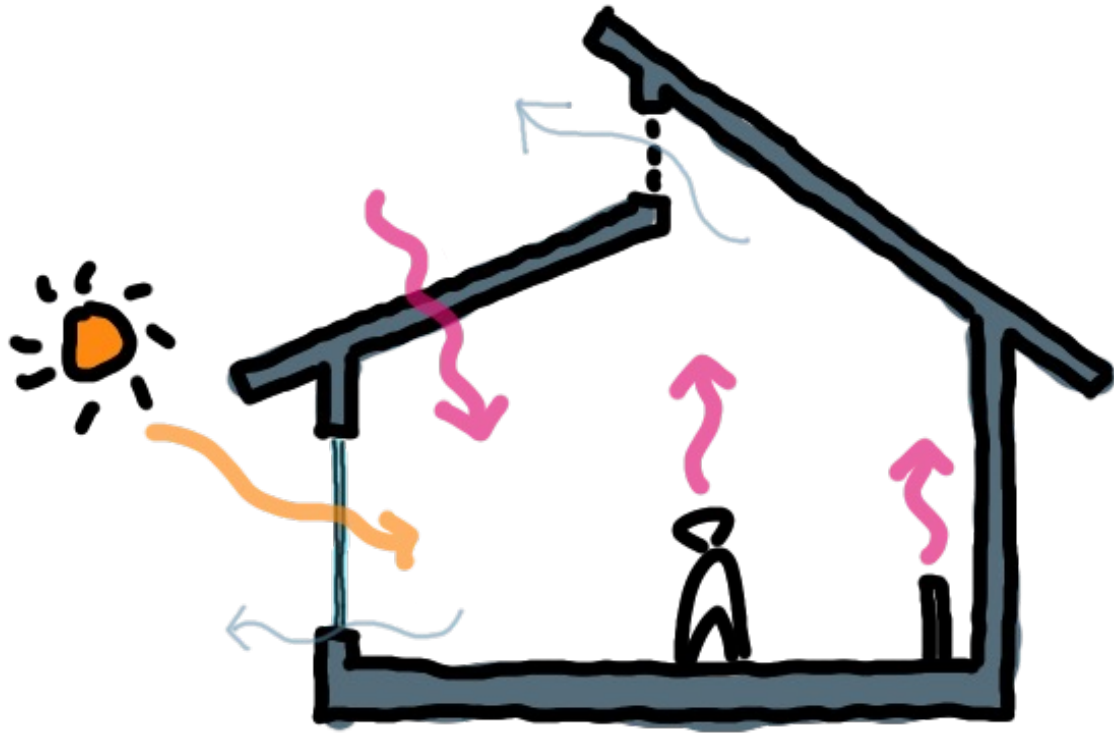
Telesilla Bristogianni (2nd mentor)

Chujie Lu (3rd mentor)

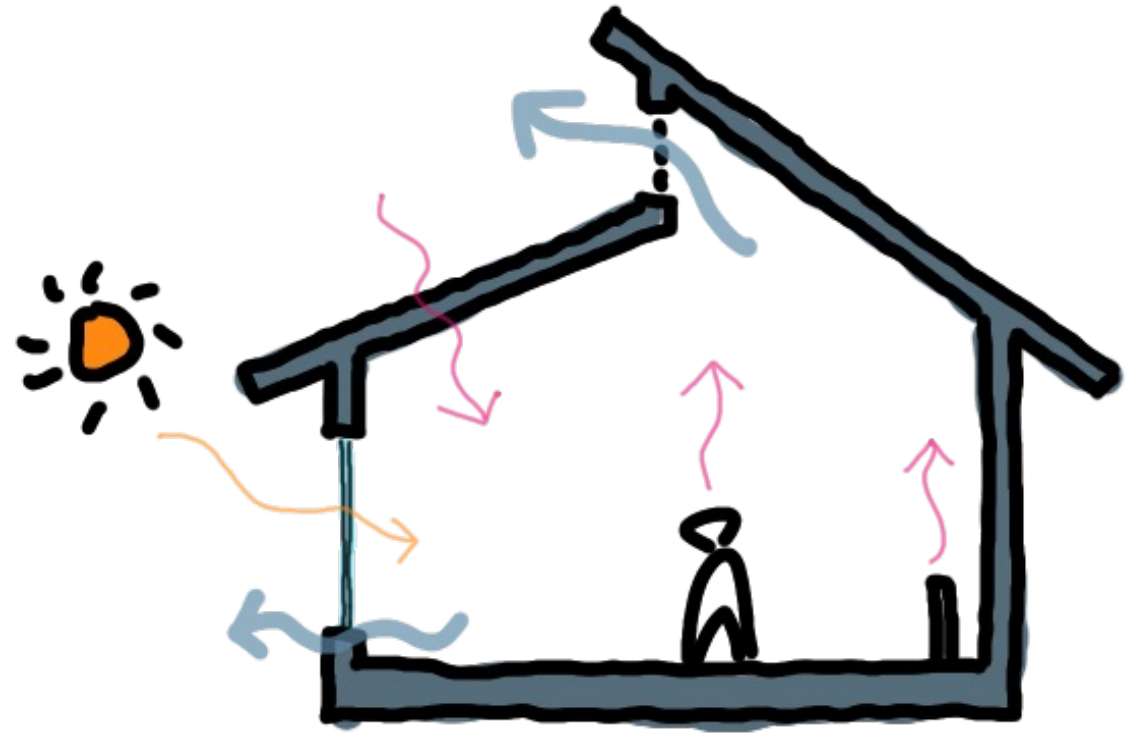
Dirk Dubbeling (External delegate)



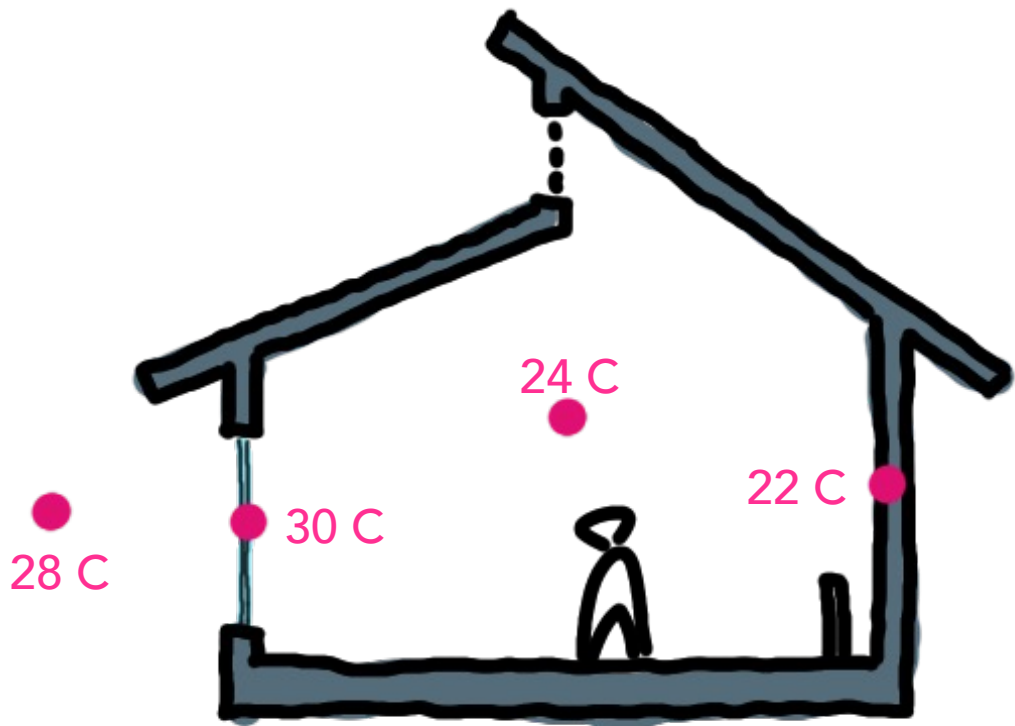
Energy in = Energy out



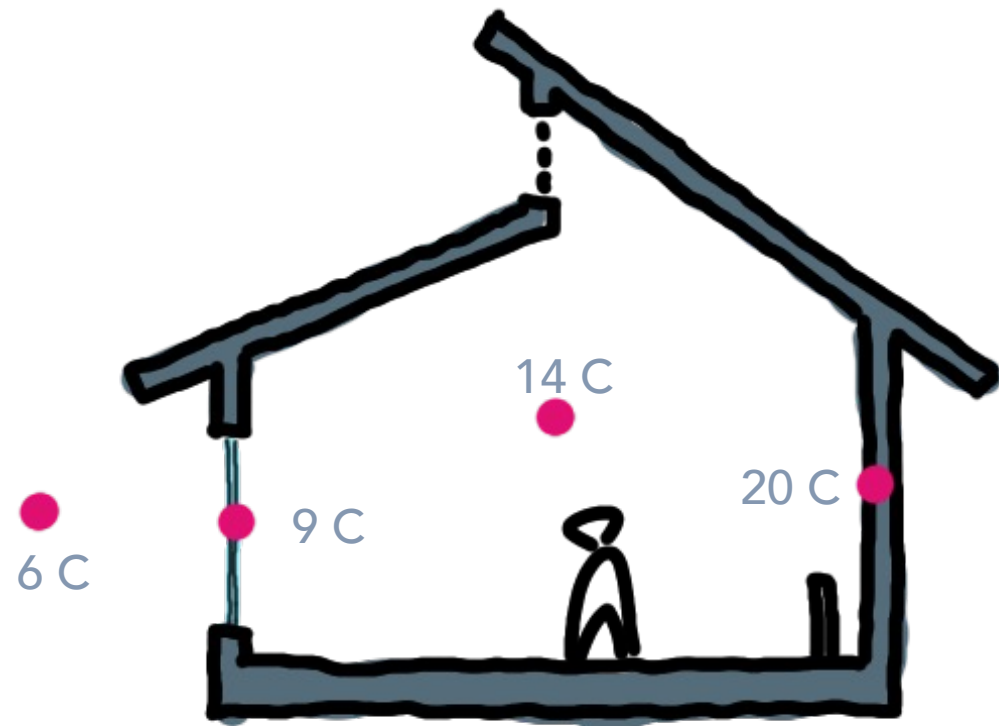
Too much heat!



Too cold!



Summer



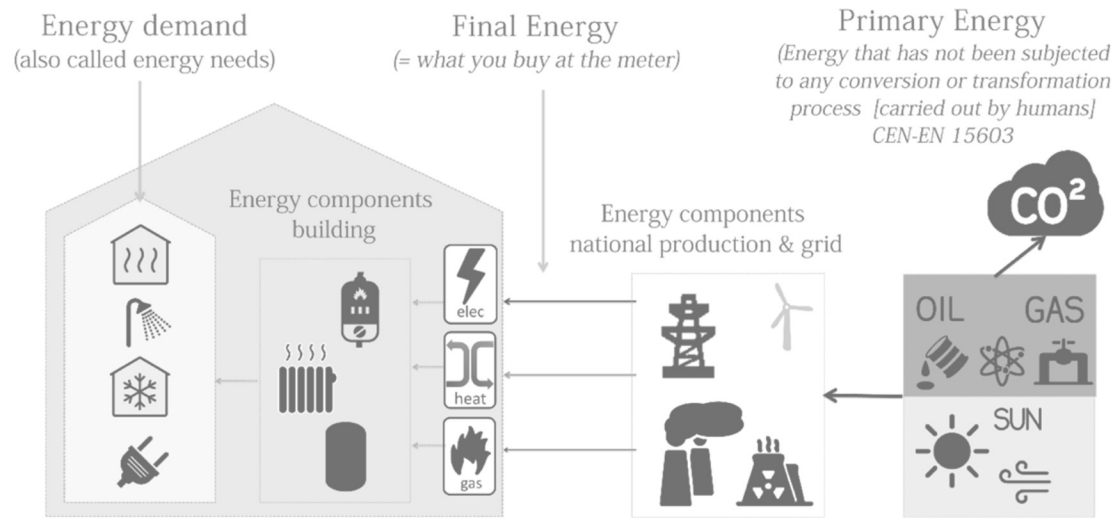
Winter



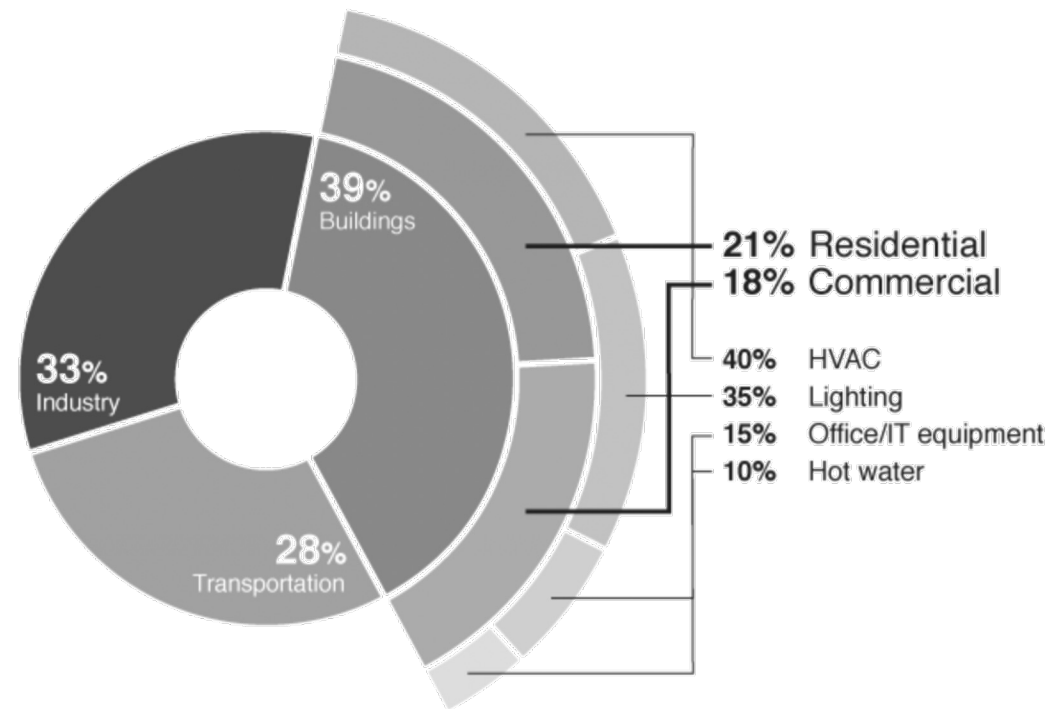
Radiating Heat
Room becomes warm



Absorbing Heat
Room becomes cold



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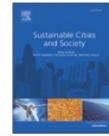


Retrofitting

Modifying/adding something on the glass to reduce the heat transfer

Smart Control

Optimizing energy saving and thermal comfort



A Critical Review of Façade Retrofit Measures for Minimizing Heating and Cooling Demand in Existing Buildings

Soad Sarihi, Fatemeh Mehdizadeh Saradj*, Mohsen Faizi

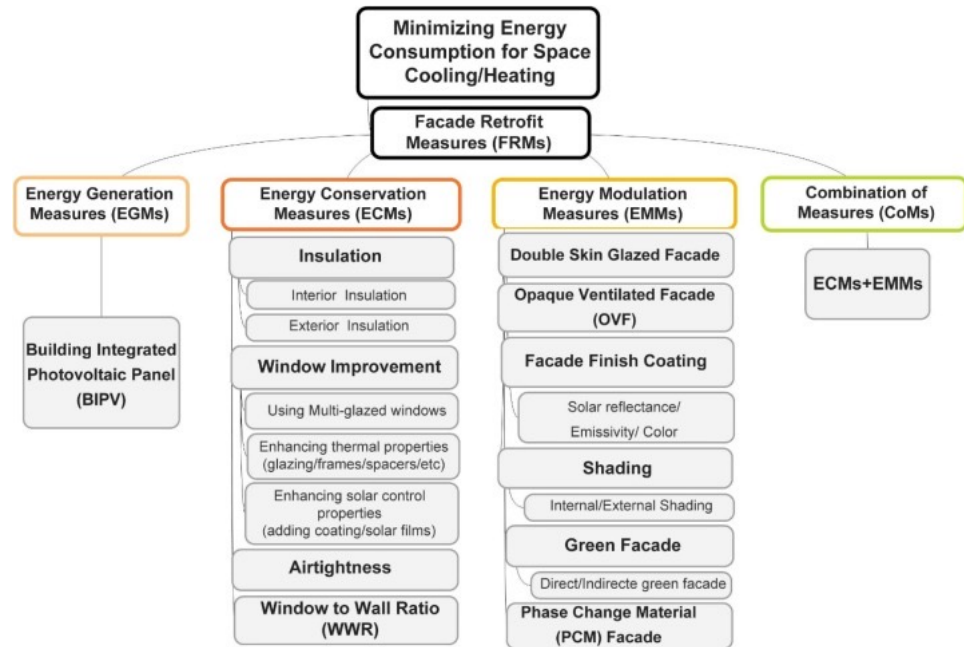
Department of architecture, Iran university of science and technology, Narmak Street, Tehran, 1684613114, Tehran, Iran

ARTICLE INFO

Keywords:
 Façade Retrofit
 Energy Conservation Measures
 Energy Modulation Measures
 Existing Buildings
 Cooling
 Heating

ABSTRACT

The building industry is currently experiencing a myriad of challenges, including low energy performance in existing buildings. Since the façade considerably contributes to heating and cooling in buildings, façade retrofit is presumed as an effective solution to minimize cooling and heating demand in existing buildings. In-depth scrutiny in façade retrofit actions reveals different Façade Retrofit Measures (FRMs) that aim to minimize cooling and heating demand in existing buildings. They include Energy Conservation Measures (ECMs), which prevent excessive heat transmittance, and Energy Modulation Measures (EMMs), which modulate energy consumption through passive heating and cooling strategies. A Combination of Measures (CoMs) is also the state-of-the-art in the face of retrofit actions. In this paper, a further analysis elaborates on the effectiveness of each measure in Cooling-Dominated (CD) and Heating-Dominated (HD) climates. This analysis showed that façade retrofit could reduce energy consumption for heating and cooling by up to 50% through architectural interventions. The study findings also revealed that ECMs effectively minimize energy consumption in a heating-dominated climate by lowering conductive and convective heat transfer. However, EMMs are more crucial in reducing energy consumption in a cooling-dominated climate by controlling radiative heat transfer.



Challenges and opportunities of machine learning control in building operations

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Abstract

Machine learning control (MLC) is a highly flexible and adaptable method that enables the design, modeling, tuning, and maintenance of building controllers to be more accurate, automated, flexible, and adaptable. The research topic of MLC in building energy systems is developing rapidly, but to our knowledge, no review has been published that specifically and systematically focuses on MLC for building energy systems. This paper provides a systematic review of MLC in building energy systems. We review technical papers in two major categories of applications of machine learning in building control: (1) building system and component modeling for control, and (2) control process learning. We identify MLC topics that have been well-studied and those that need further research in the field of building operation control. We also identify the gaps between the present and future application of MLC and predict future trends and opportunities.

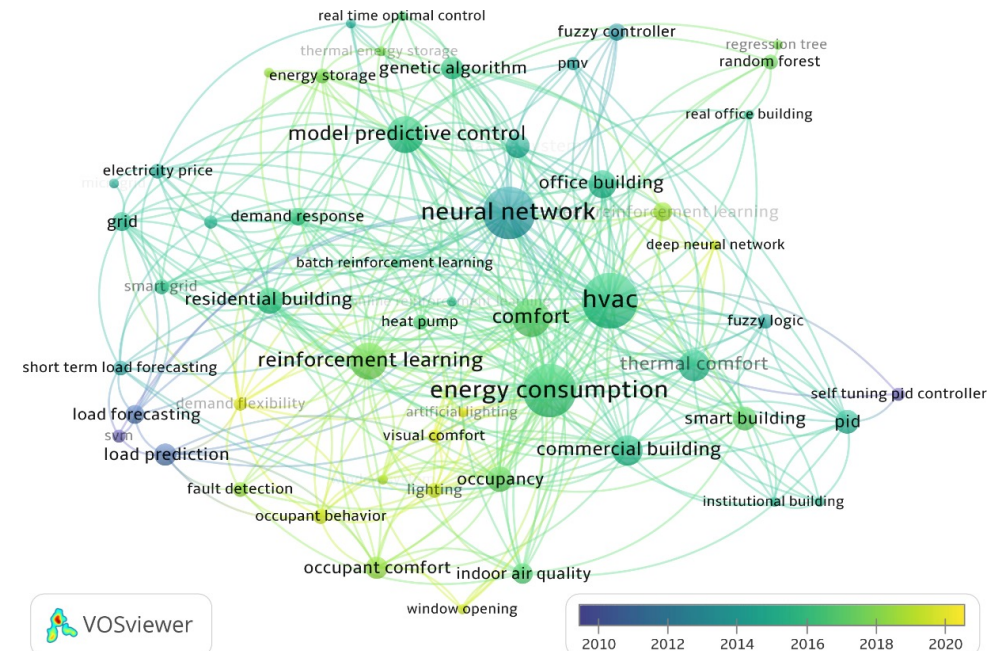
Keywords

machine learning;
 building operation control;
 building energy system;
 reinforcement learning

Article History

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What is the **optimal strategy** for **reducing energy demand** and maintaining **thermal comfort** in glass façade buildings: **modifying the existing building system, implementing retrofitting strategies**, or employing **a combination of both** approaches?

What is the optimal strategy for reducing energy demand and maintaining thermal comfort in glass façade buildings: modifying the existing building system, implementing retrofitting strategies, or employing a combination of both approaches?

Smart Control (MPC)

How can a model be developed for model prediction, and what is the problem formulation for the control?

How does the integration of MPC affect energy efficiency and occupant comfort?

Retrofitting

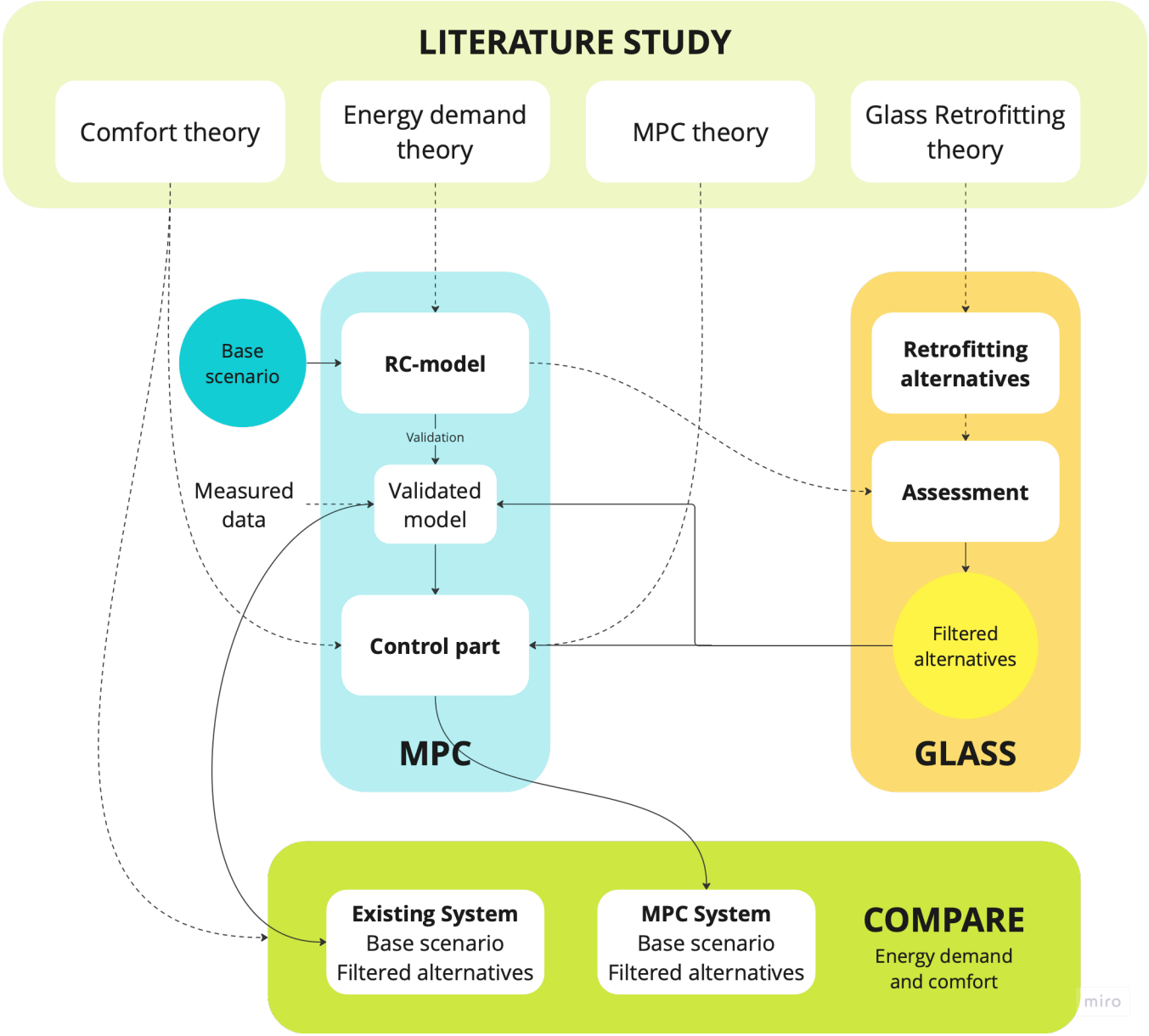
What are the retrofitting options that doesn't influence the glass façade look?

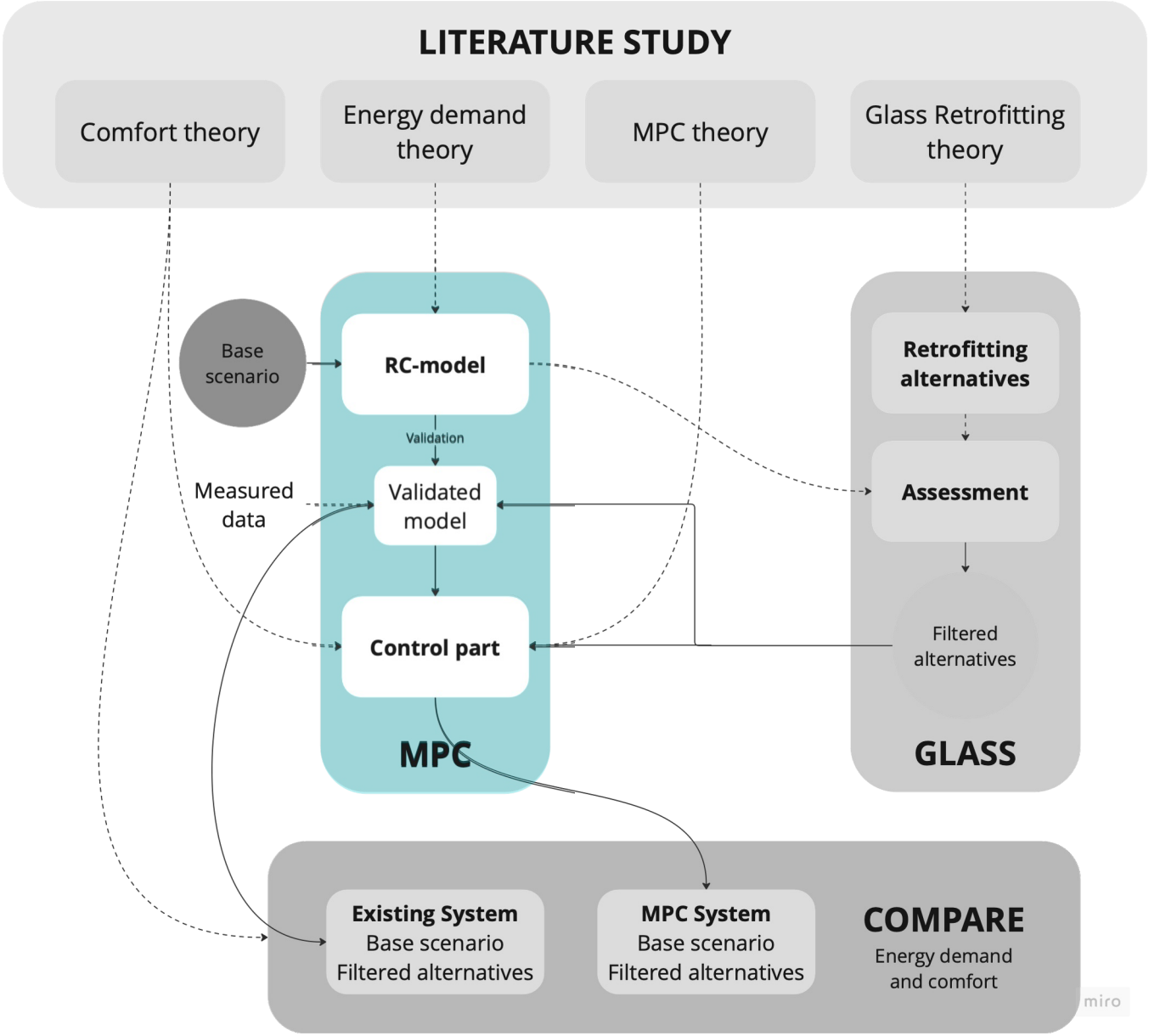
How do they impact energy consumption and thermal comfort?

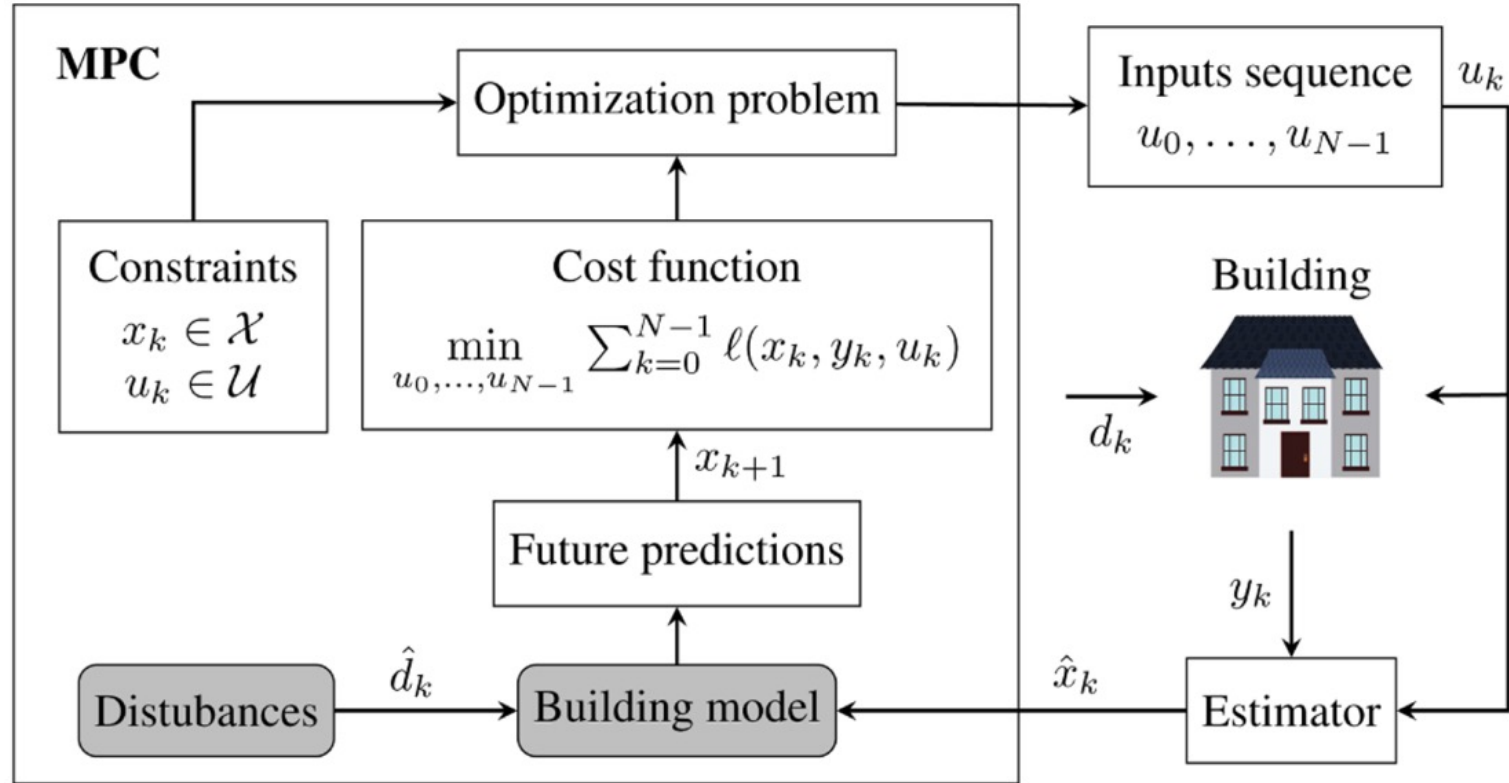
MPC + Retrofitting

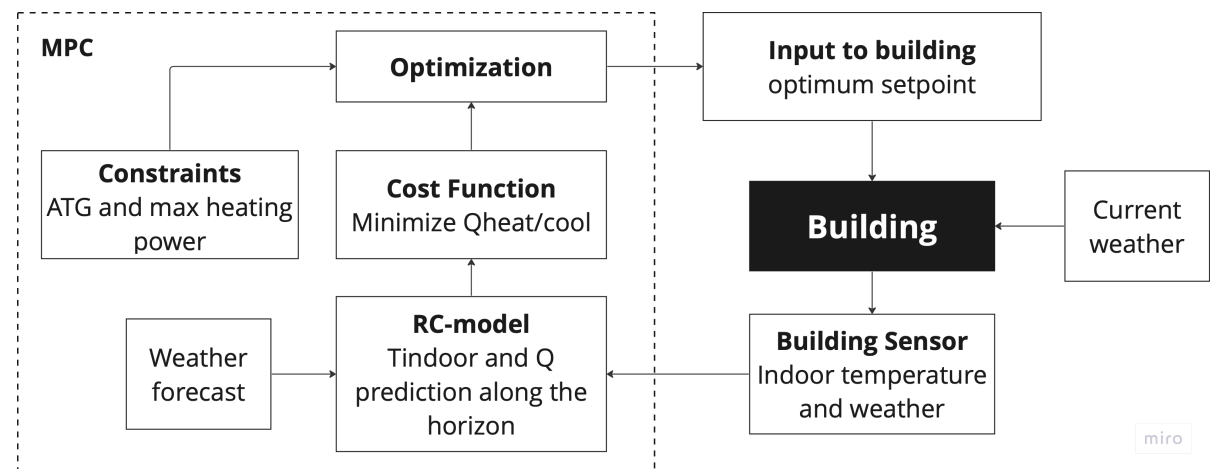
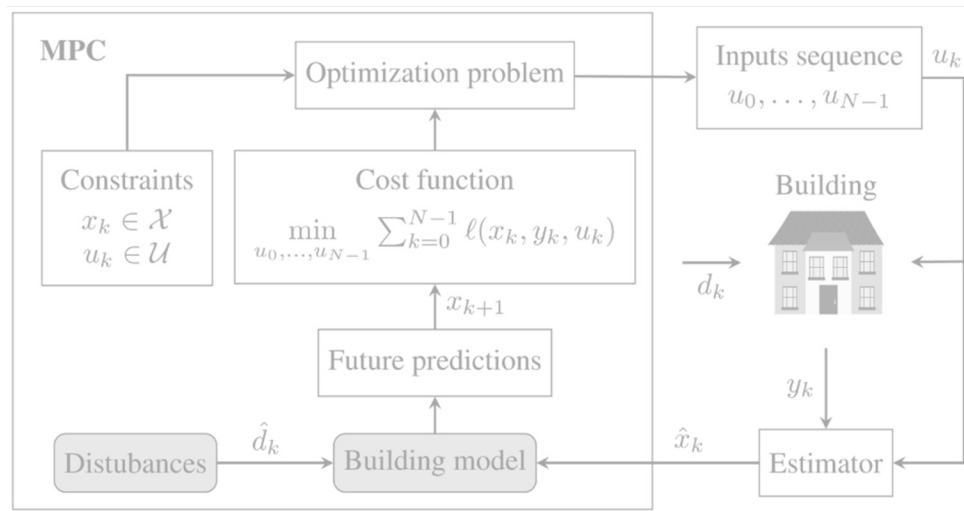
What are the comparative advantages and disadvantages (in relation to energy demand and thermal comfort) of modifying building systems vs implementing retrofitting strategies?

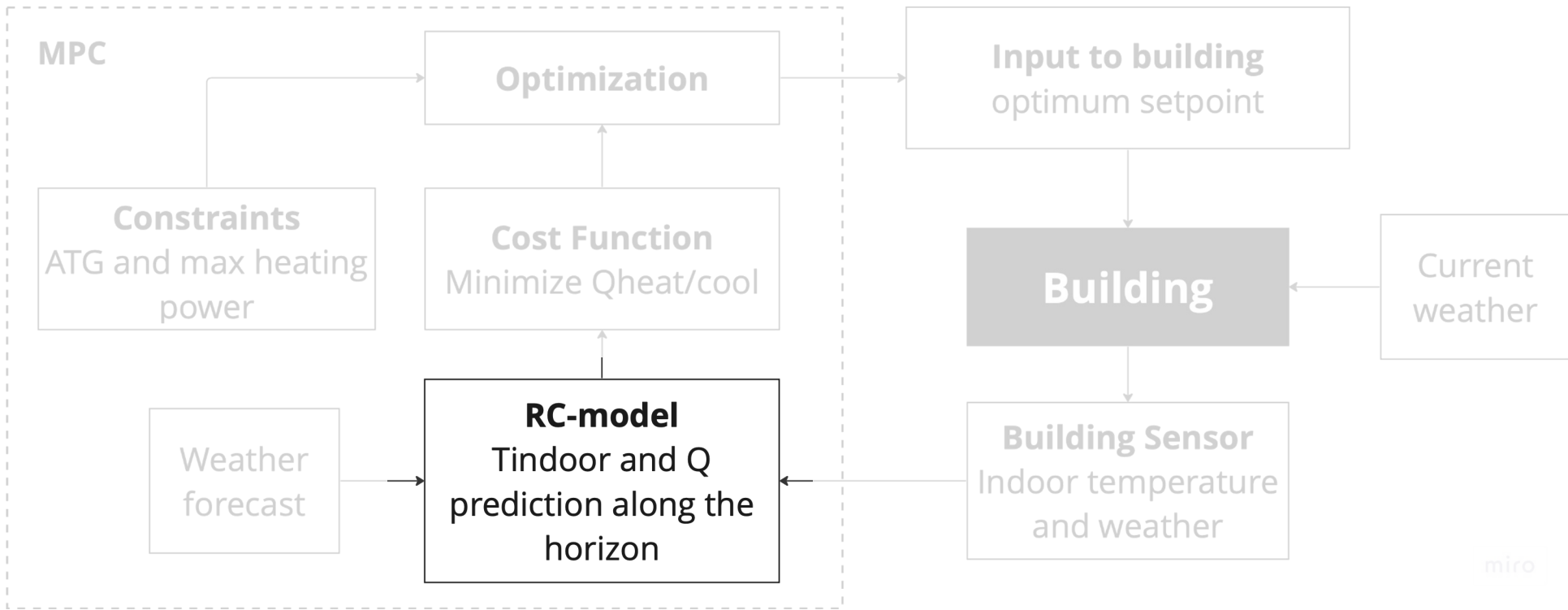
What is the effectiveness of combining building system modifications with retrofitting strategies in achieving optimal energy savings and comfort levels?



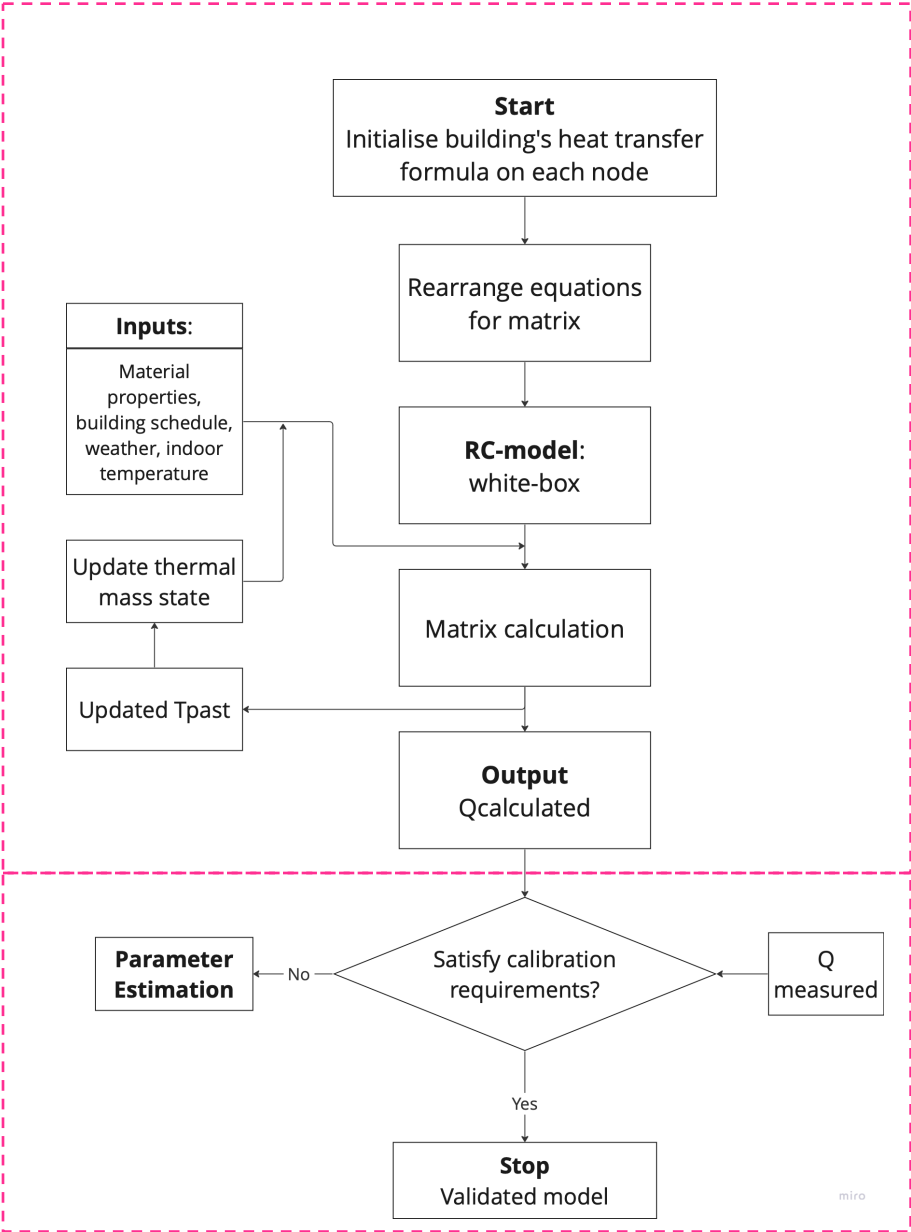






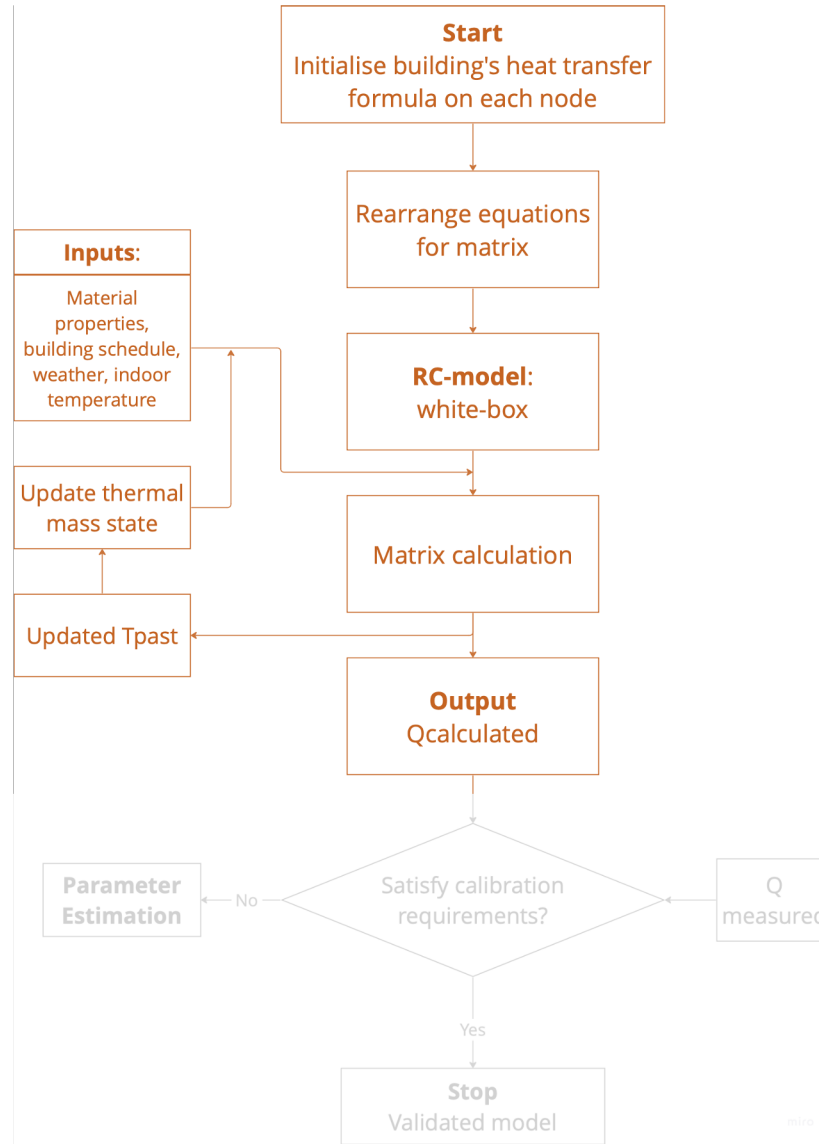


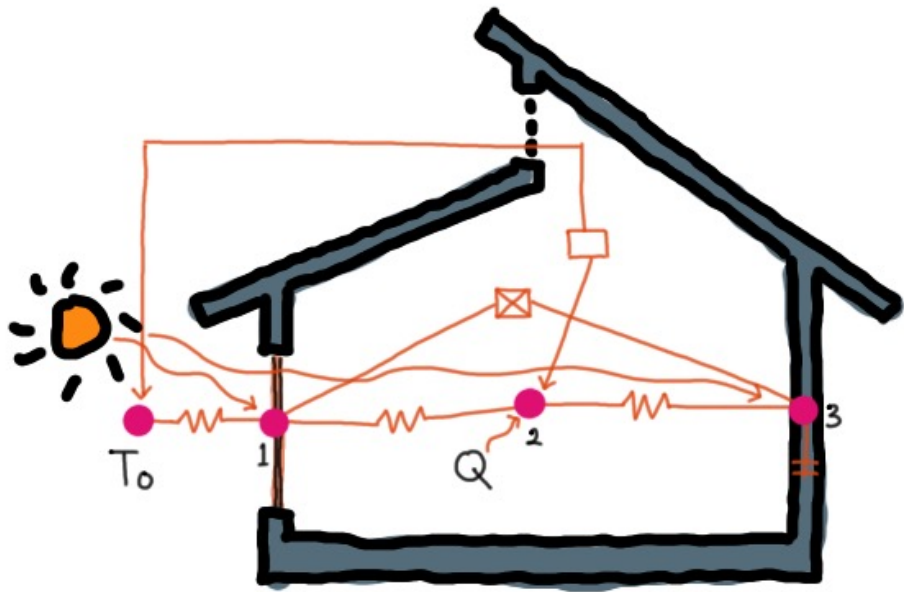
miro



Prediction calculation

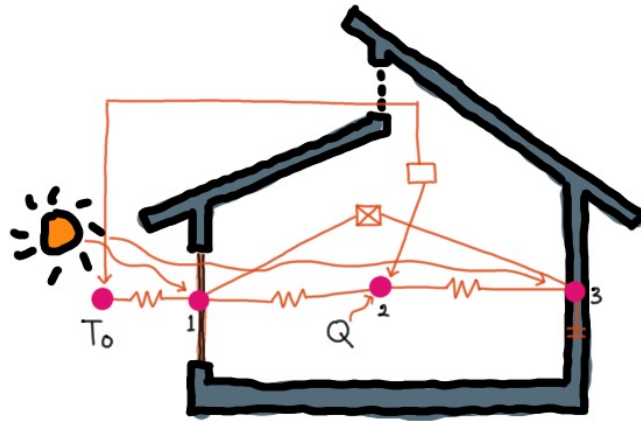
Calculation validation





Simple room example

Symbols	Description	Equations
	Absorbed solar radiation	$A_1 \times A_{gl} \times Q_z$
	Heating	Q_{heat}
	Advection	$\rho_{air} \times V_{air} \times C_{p_{air}} \times \Delta T$
	Convection	$\alpha_{conv} \times A_s \times \Delta T$
	Radiation	$\alpha_{rad} \times F \times A_s \times \Delta T$
	Conduction and accumulation using response factor method	$A_s \left(\sum_{i=0}^N X_i \times T_s^{t-i} \right)$ $N = 50 \times d_s$ $X_0 = 2/\pi \sqrt{\frac{k \times \rho \times C_{p_s}}{3600}}$ $X_n = -X_0 (2\sqrt{n} - \sqrt{n+1} - \sqrt{n-1}); n > 0$ $X_{n_{cor}} = X_n - \frac{Error}{N-1}; n > 2$ $Error = \sum_{n=0}^N X_n$



Simple room example

$$\text{Node 1} \quad \alpha_{conv_o} \cdot A_{gl} \cdot (T_o - T_1) + \alpha_{conv_i} \cdot A_{gl} \cdot (T_2 - T_1) + \alpha_{rad} \cdot A_{gl} \cdot F_{13} (T_3 - T_1) + A_1 \cdot A_{gl} \cdot Q_z = 0$$

$$\text{Node 2} \quad \alpha_{conv_i} \cdot A_{gl} \cdot (T_1 - T_2) + \alpha_{conv_i} \cdot A_w \cdot (T_3 - T_2) + \rho_{air} \cdot V_{air} \cdot C_{p_{air}} \cdot (T_o - T_2) + Q_{heat} = 0$$

$$\text{Node 3} \quad \alpha_{conv_i} \cdot A_w \cdot (T_2 - T_3) + \alpha_{rad} \cdot A_w \cdot F_{31} (T_1 - T_3) + D_1 \cdot A_{gl} \cdot Q_z = A_w (X_0 \cdot T_3 + X_1 \cdot T_3^{(t-1)} + X_2 \cdot T_3^{(t-2)} + X_3 \cdot T_3^{(t-3)} + \dots + X_n \cdot T_3^{(t-n)})$$

Equation

$$T = M^{-1}B$$

T

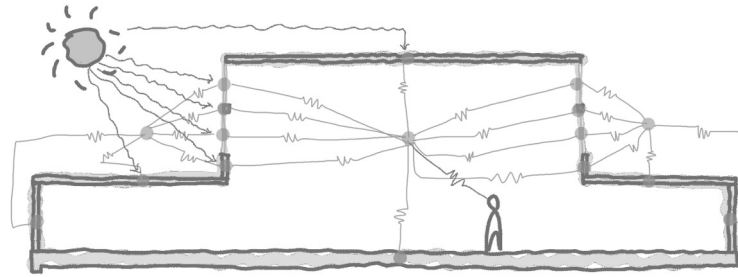
$$\begin{bmatrix} T_1 \\ Q_{heat} \\ T_3 \end{bmatrix}$$

M

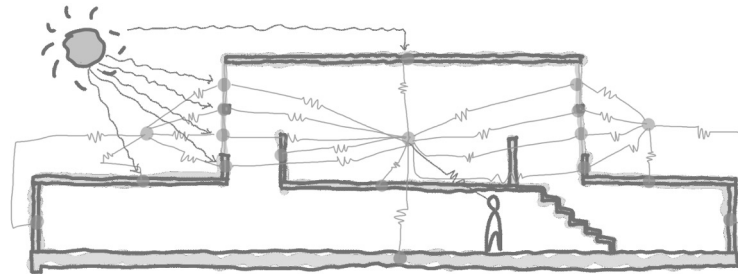
$$\begin{bmatrix} -A_{gl} \cdot (\alpha_{conv_o} \cdot -\alpha_{conv_i} \cdot -\alpha_{rad} \cdot F_{13}) & 0 & \alpha_{rad} \cdot A_{gl} \cdot F_{13} \\ \alpha_{conv_i} \cdot A_{gl} & 1 & \alpha_{conv_i} \cdot A_w \\ \alpha_{rad} \cdot A_w \cdot F_{31} & 0 & -A_w \cdot (\alpha_{conv_i} + \alpha_{rad} \cdot F_{31} + X_0) \end{bmatrix}$$

B

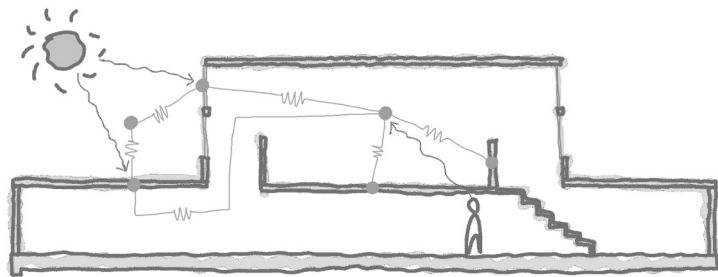
$$\begin{bmatrix} -A_1 \cdot A_{gl} \cdot Q_z - \alpha_{conv_o} \cdot A_{gl} \cdot T_o - \alpha_{conv_i} \cdot A_{gl} \cdot T_2 \\ (\alpha_{conv_i} \cdot A_{gl} + \alpha_{conv_i} \cdot A_w + \rho_{air} \cdot V_{air} \cdot C_{p_{air}}) \cdot T_2 - \rho_{air} \cdot V_{air} \cdot C_{p_{air}} \cdot T_o \\ -D_1 \cdot A_{gl} \cdot Q_z + A_w (X_1 \cdot T_3^{(t-1)} + X_2 \cdot T_3^{(t-2)} + X_3 \cdot T_3^{(t-3)} + \dots + X_n \cdot T_3^{(t-n)}) - \alpha_{conv_i} \cdot A_w \cdot T_2 \end{bmatrix}$$



Version 1

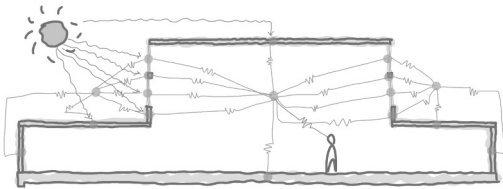


Version 2




Version 3

version 1

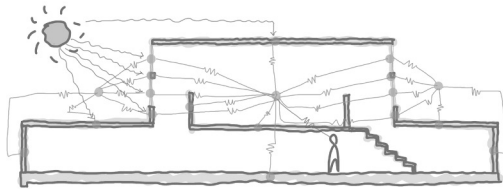



 Envelope only

 20 nodes


 20 x 20 matrix

version 2

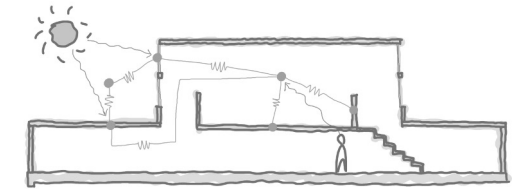


 Envelope and inner mass

 22 nodes


 22 x 22 matrix

version 3

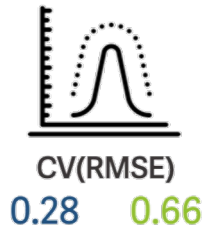
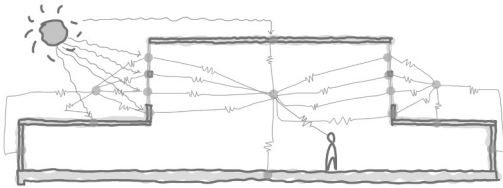


 Lumped envelope and inner mass

 5 nodes

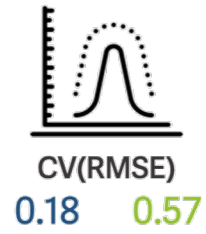
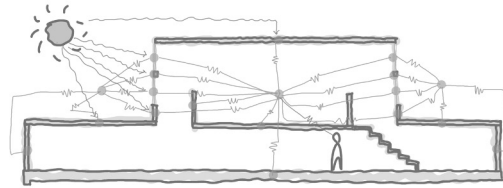
 5 x 5 matrix

version 1



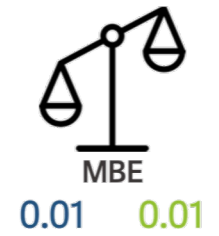
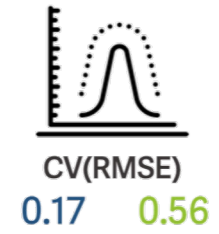
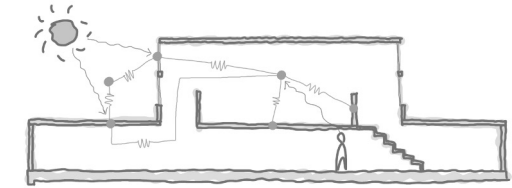
Winter Summer

version 2



Winter Summer

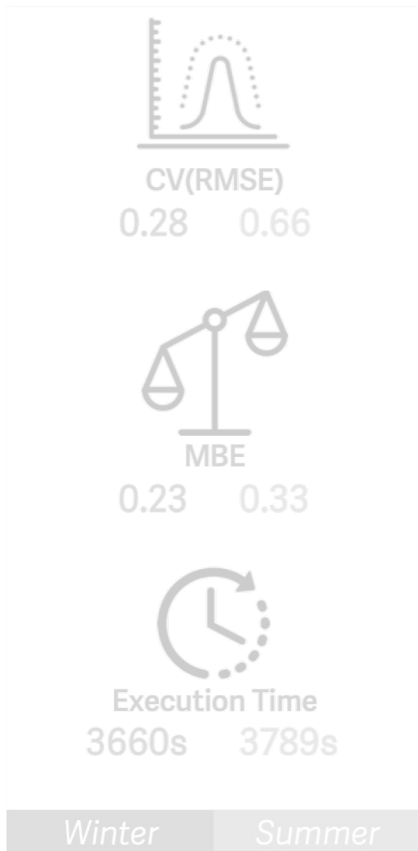
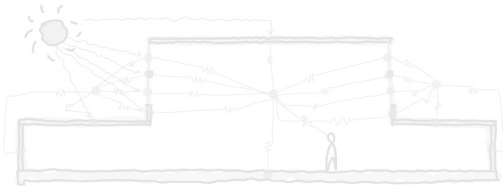
version 3



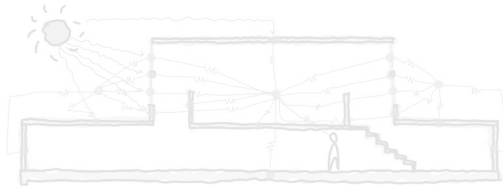
Winter Summer

CV(RMSE) should be <30% and MBE should be <10% for hourly calibration.

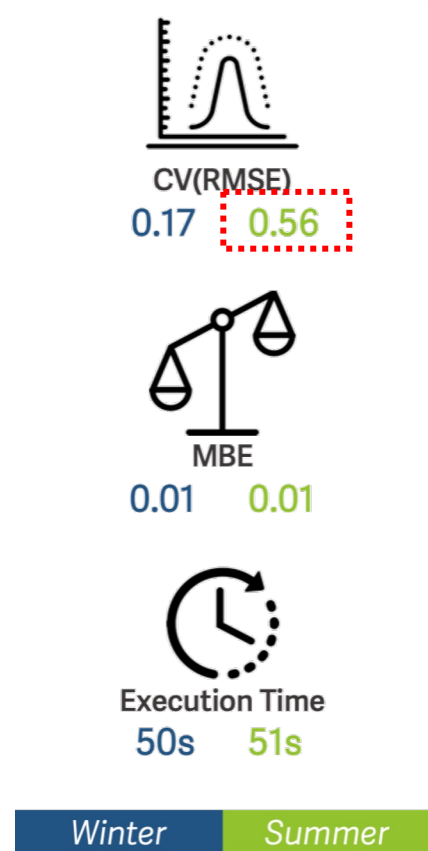
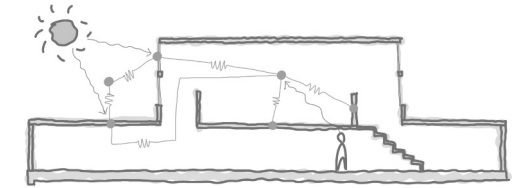
version 1



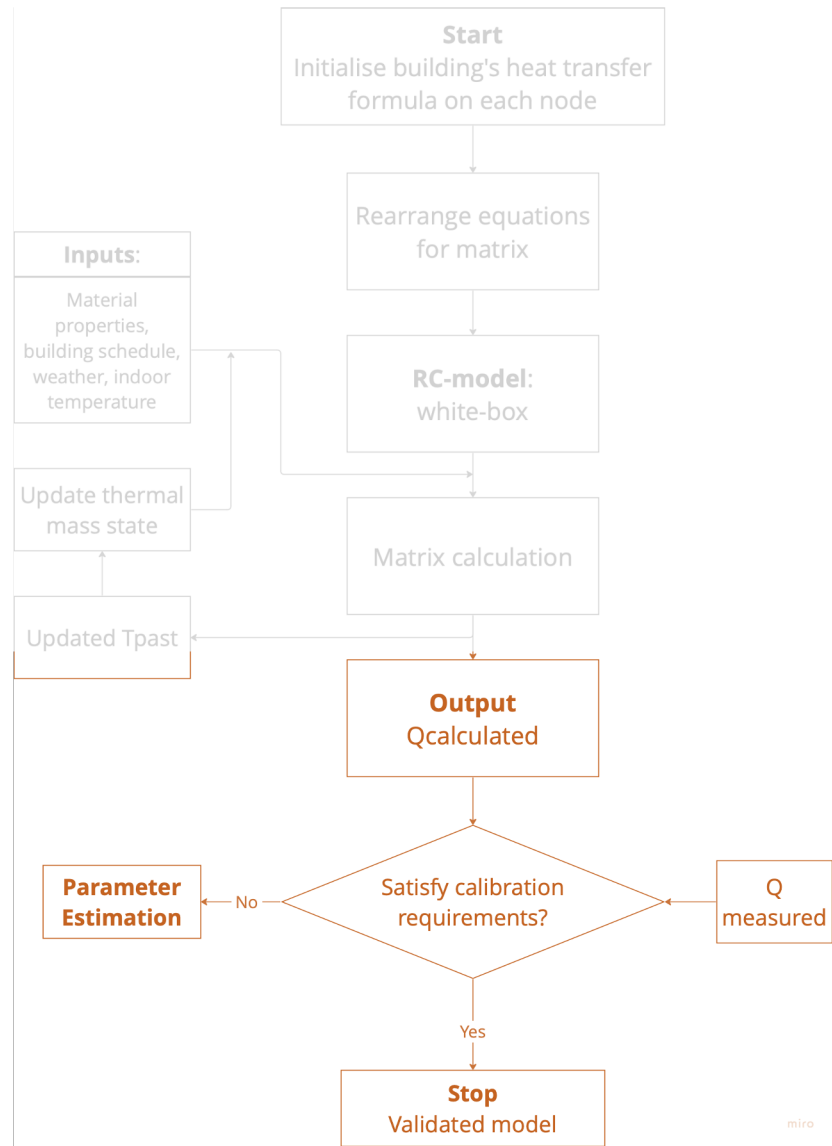
version 2

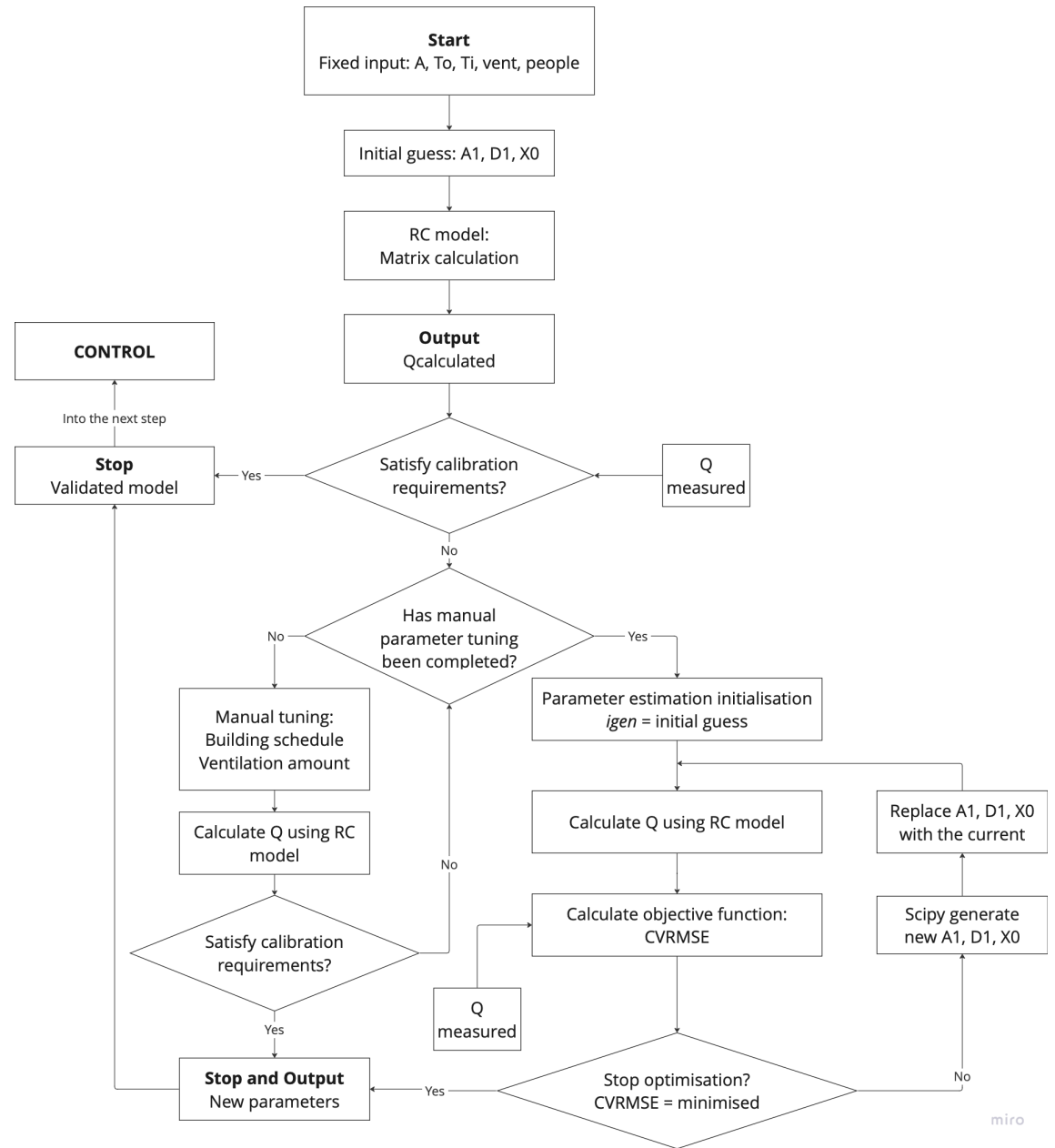


version 3

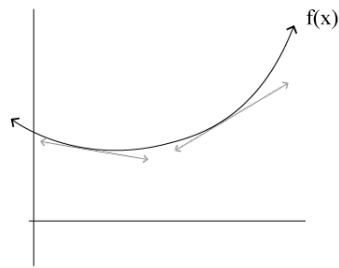


CV(RMSE) should be <30% and MBE should be <10% for hourly calibration.

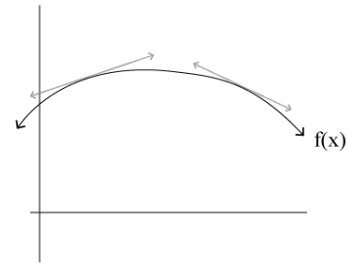




Derivative based algorithm



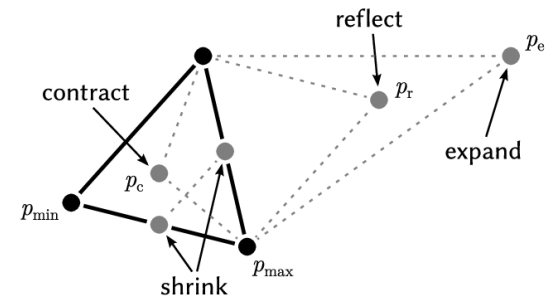
Concave Up
(tangent lines are *below* the curve)



Concave Down
(tangent lines are *above* the curve)

L-BFGS-B and SLSQP

Non-derivative based algorithm



Nelder-Mead

attempt 1



Parameters

Sun absorption of glass and opaque



Results

Parameter values and CV(RMSE)
did not change

attempt 2



Parameters

Sun absorption of glass and opaque
(different starting values)



Results

Parameter values changed but
CV(RMSE) did not change

attempt 3



Parameters

Sun absorption of glass and opaque
+ thermal mass of inner surface



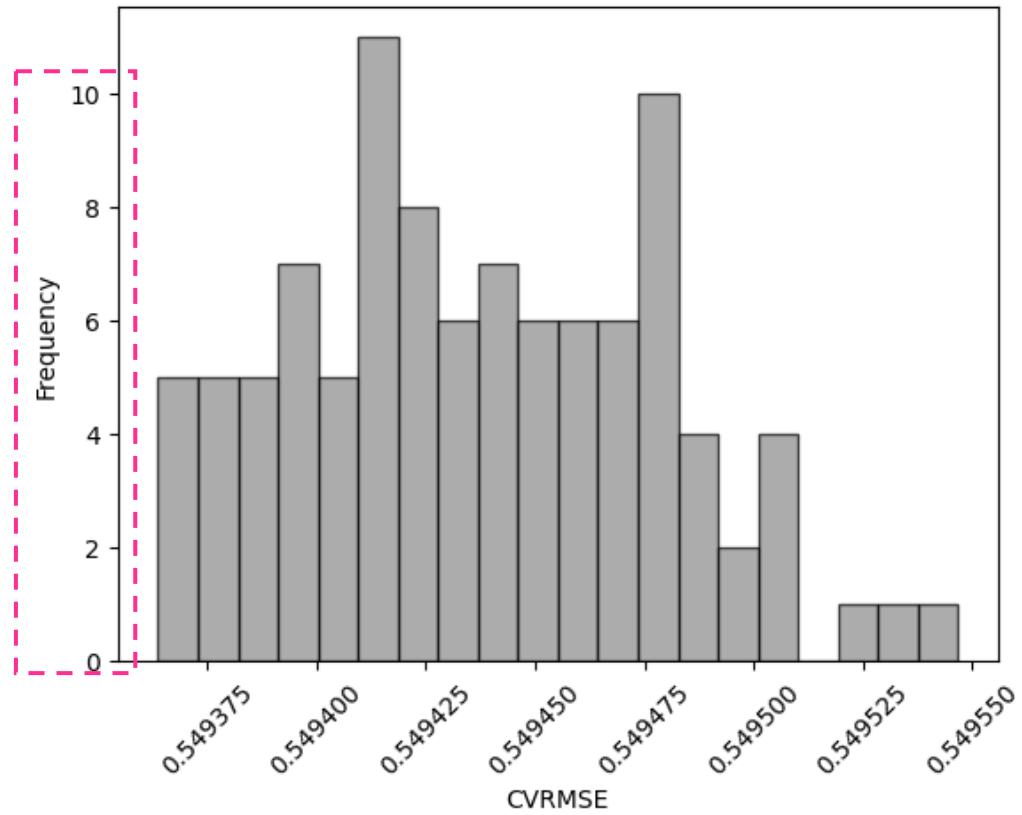
Results

CV(RMSE) still not changed

*The algorithms were sensitive with decimal starting point,
but why did the CV(RMSE) stay the same?*

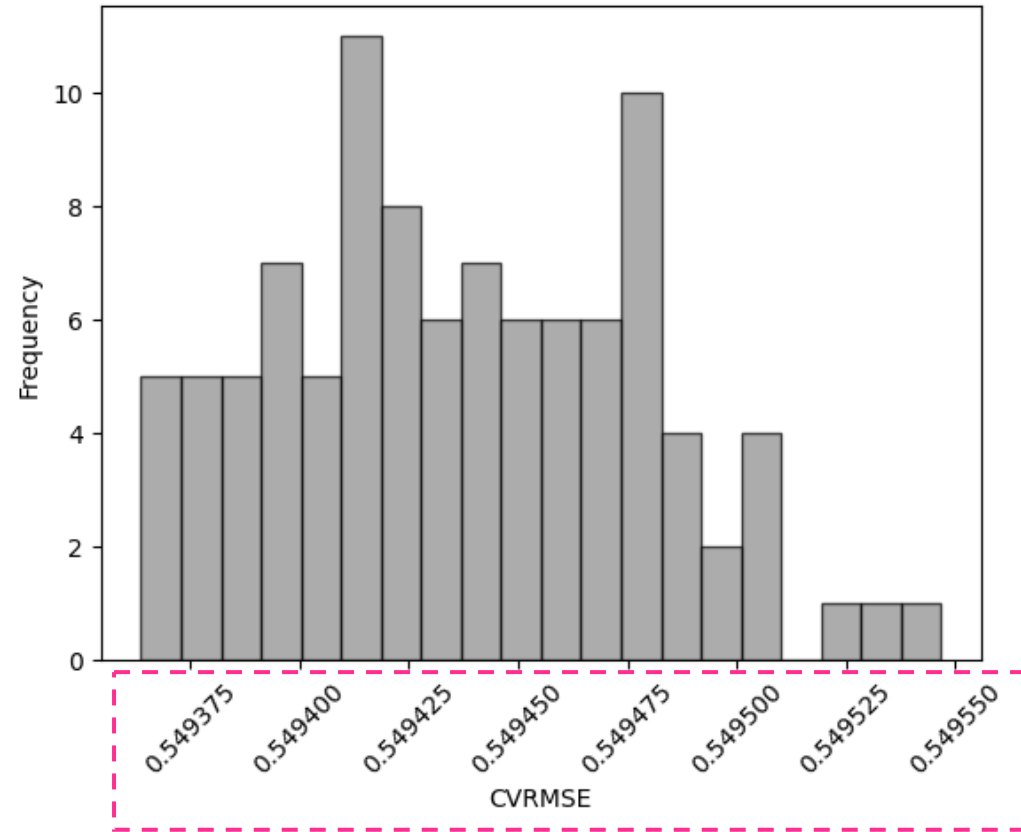
attempt 4

*100 set of parameters
(randomly picked from 3rd attempt)*



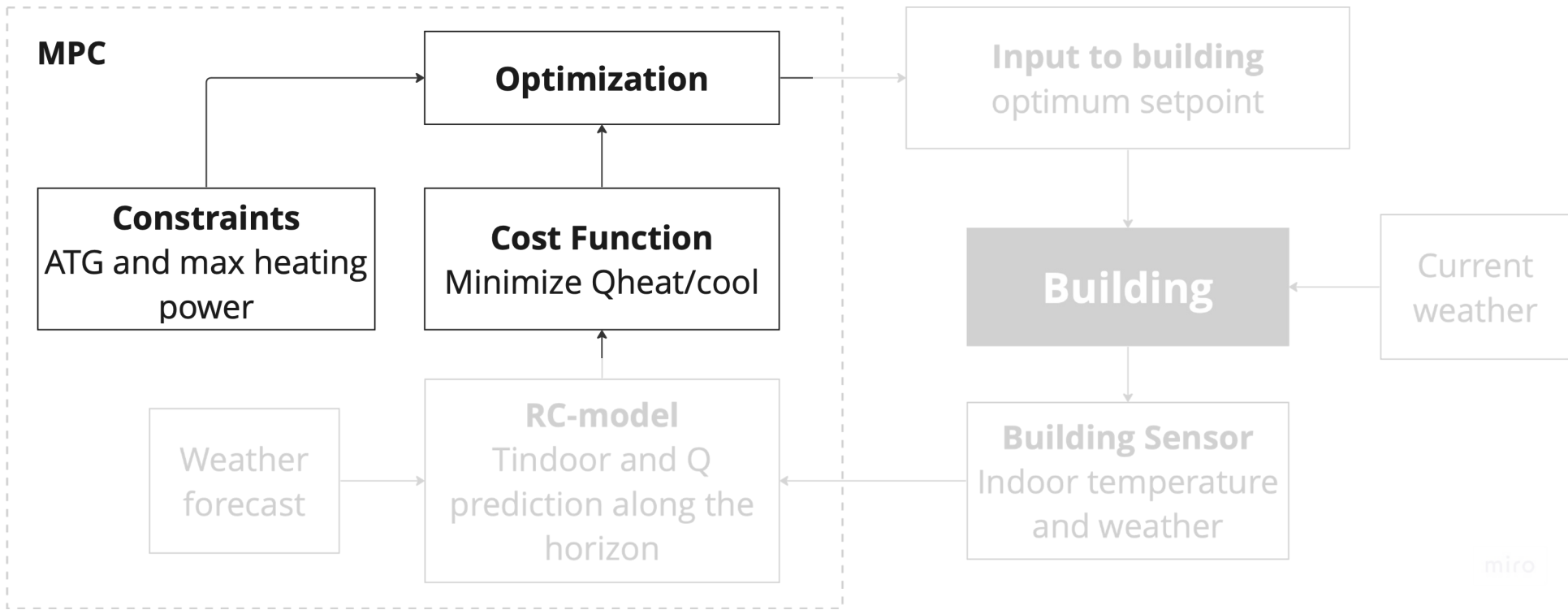
Monte-Carlo simulation

attempt 4

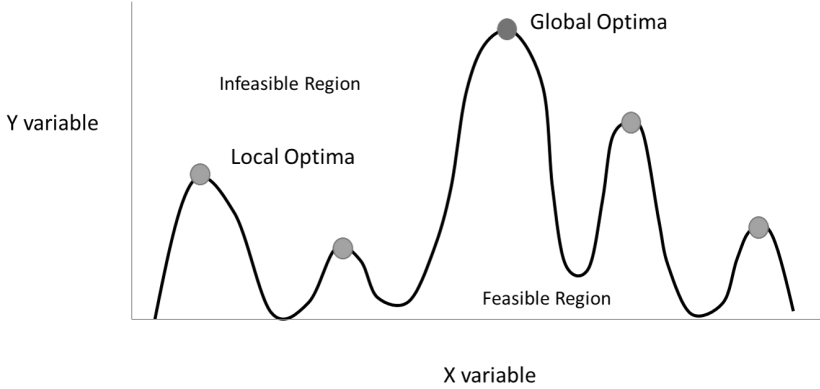


Distribution of the CVMSE is narrow

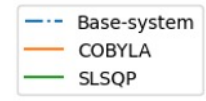
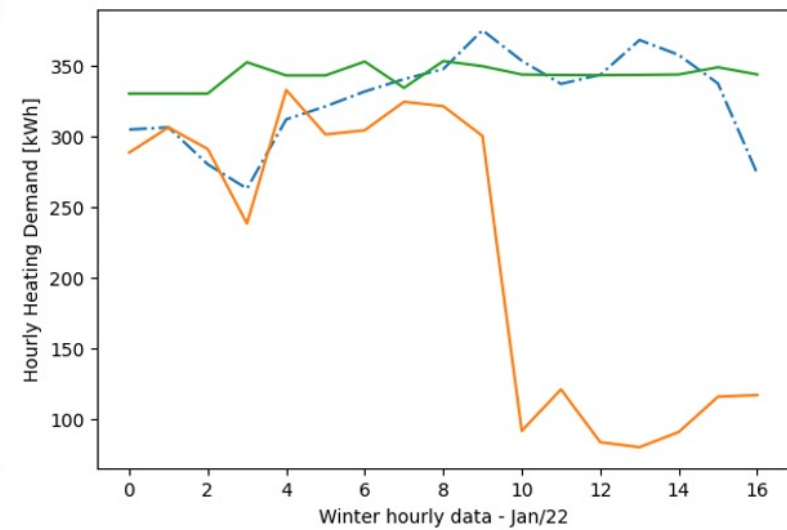
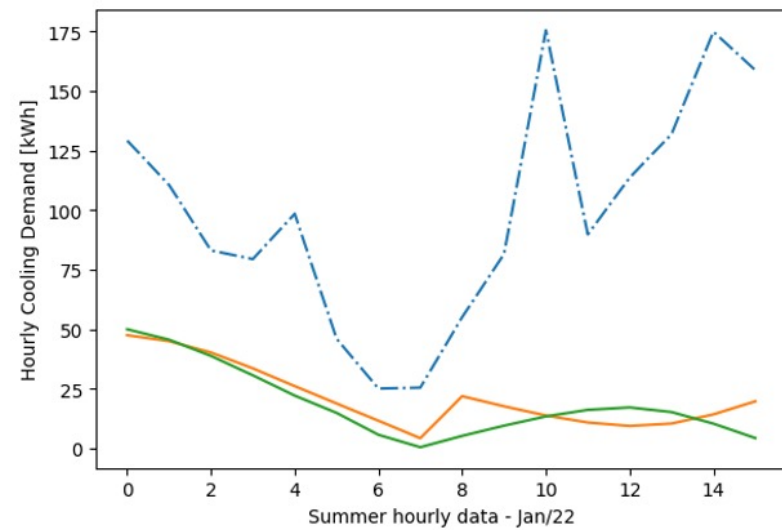
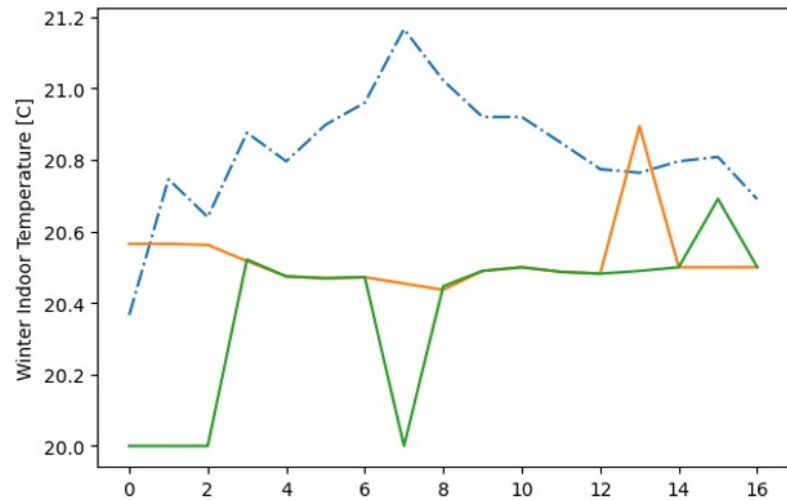
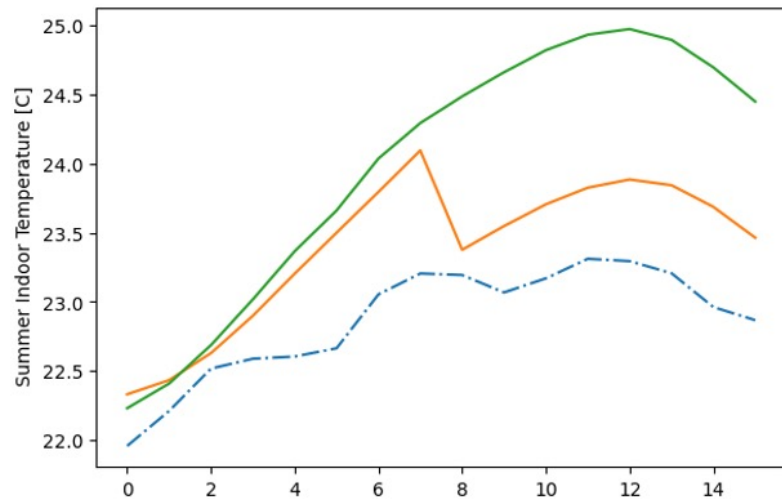
Monte-Carlo simulation



Local Optimum Algorithm



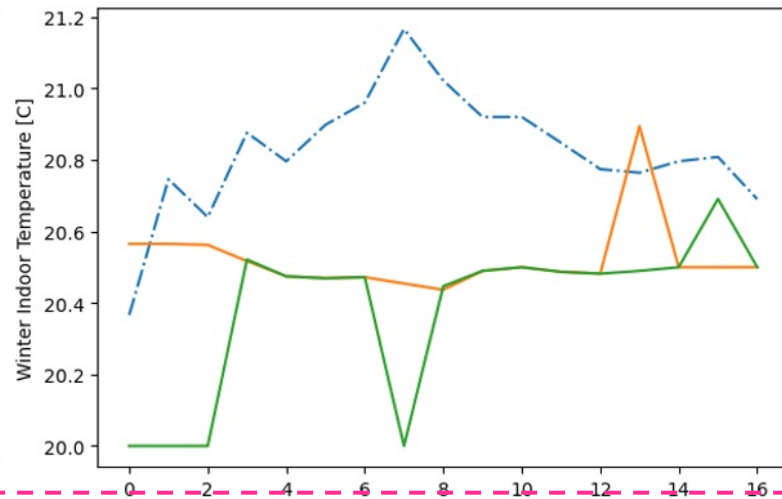
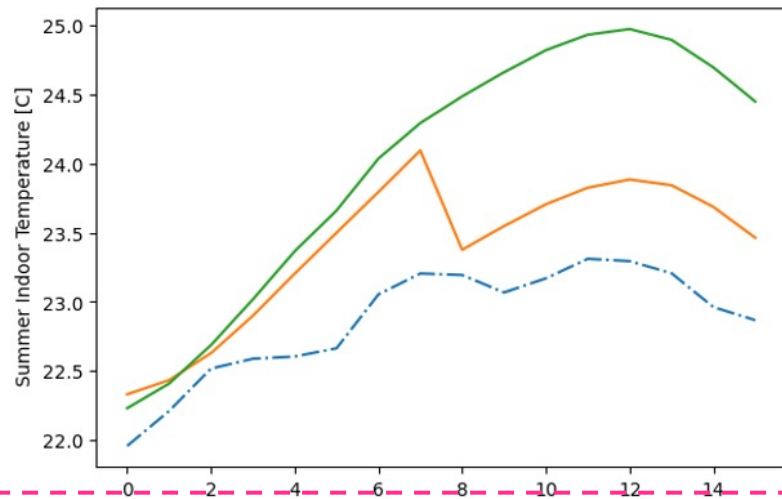
COBYLA and SLSQP



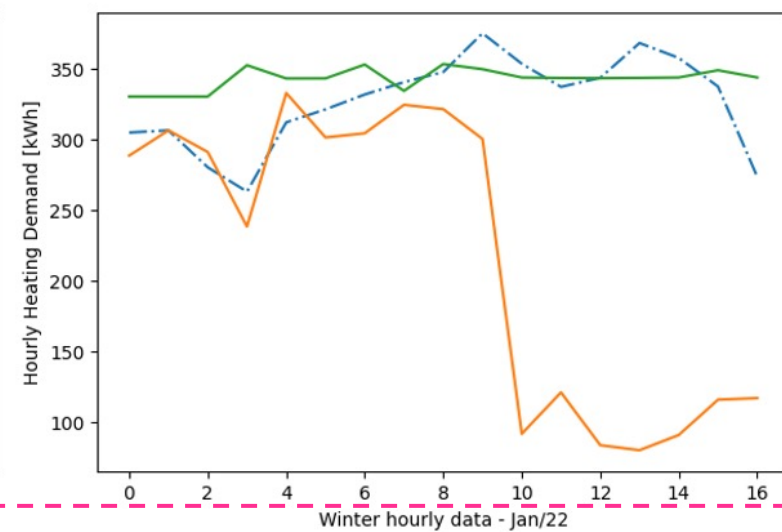
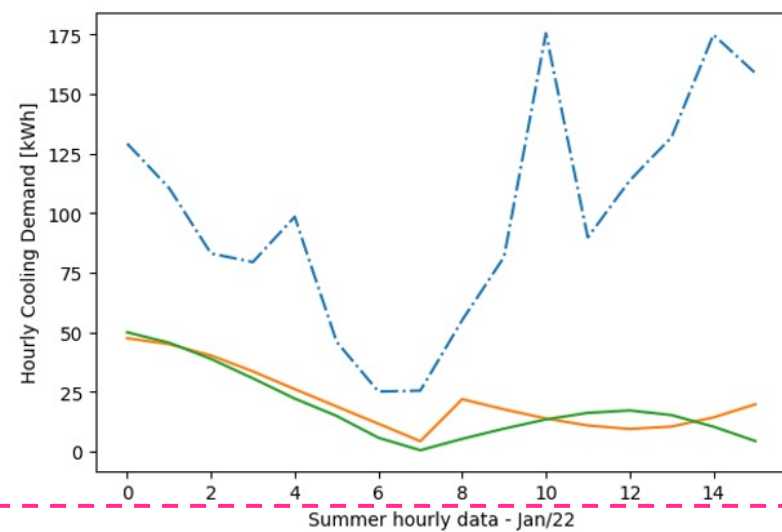
SLSQP is smoother

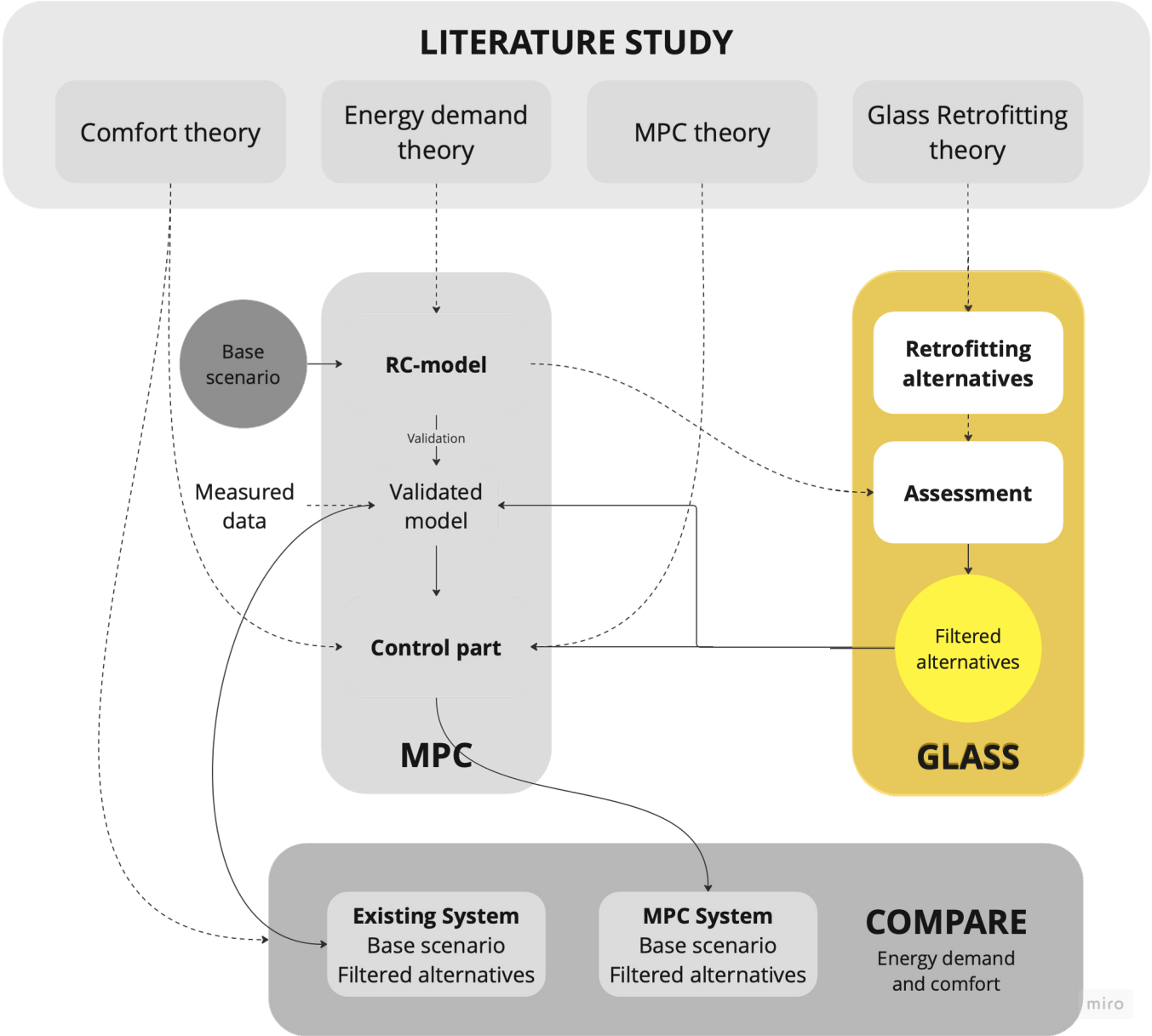
COBYLA is more aggressive

Indoor temperature



Energy demand







Change composition



Add shading



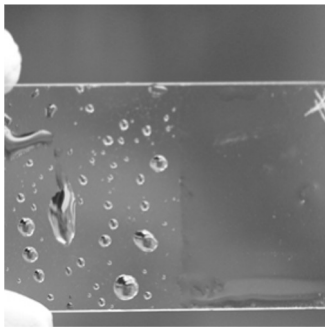
Change glass



Add enamels



Add films



Add coatings



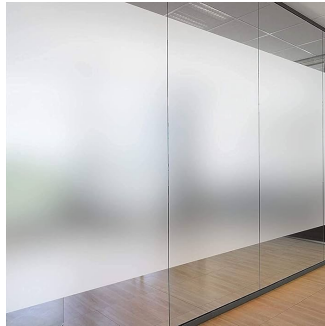
Add paints



Add PCM



Add Curtains



*Add
films*



*Add
Curtains*



Installed in
uncontrolled-env



Keep the existing
glass in place



Quick installation
time



No special
maintenance

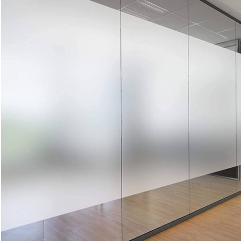


No additional
structure



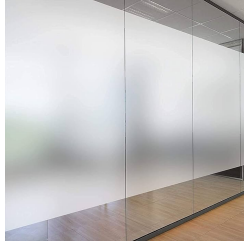
Keep the façade
look

System 1



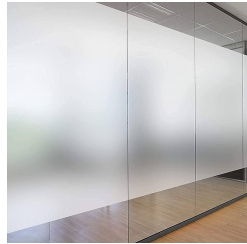
Low-E film

System 2



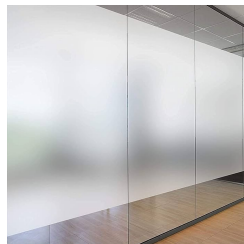
Insulating film

System 3



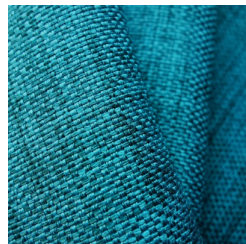
Solar control film (inside)

System 4



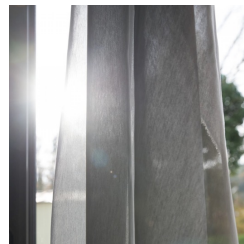
Solar control film (outside)

System 5



Curtain 0% openness

System 6



Curtain 28% openness

System 7

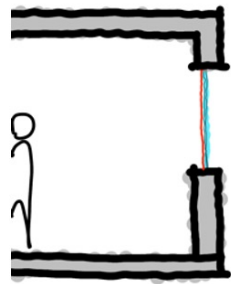


Curtain 54% openness

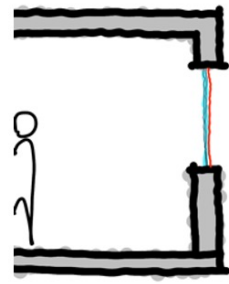
System 8



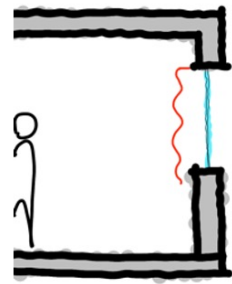
Air pocket curtain



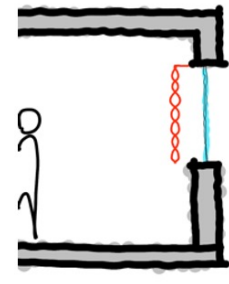
System 1-3



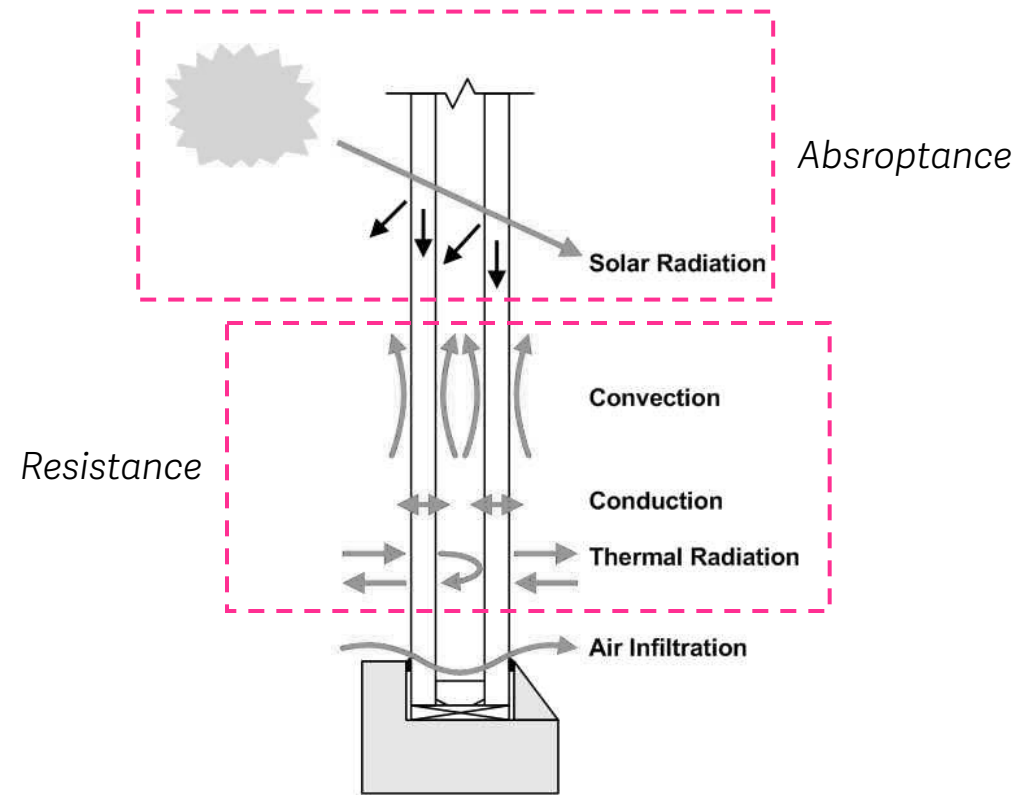
System 4



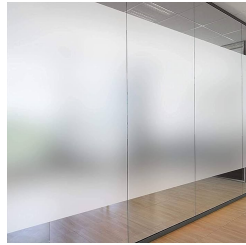
System 5-7



System 8

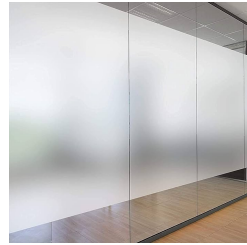


System 1



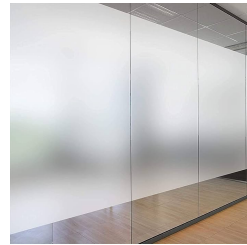
Low-E
film

System 2



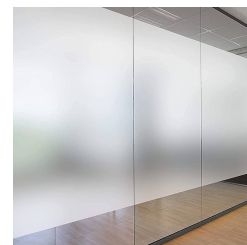
Insulating
film

System 3



Solar control
film (inside)

System 4



Solar control
film (outside)

<i>System</i>	<i>R strategy</i> <i>[m²K/W]</i>	<i>R total</i> <i>[m²K/W]</i>	<i>U-value total</i> <i>[W/m²K]</i>	<i>SHGC total</i>
Base	-	0.606	1.65	0.4
1	-	0.82	1.22	0.29
2	0.23	0.84	1.19	0.28
3	0.007	0.613	1.63	0.328
4	0.0004	0.6064	1.65	0.236

System 5



Curtain
0% openness

System 6



Curtain
28% openness

System 7



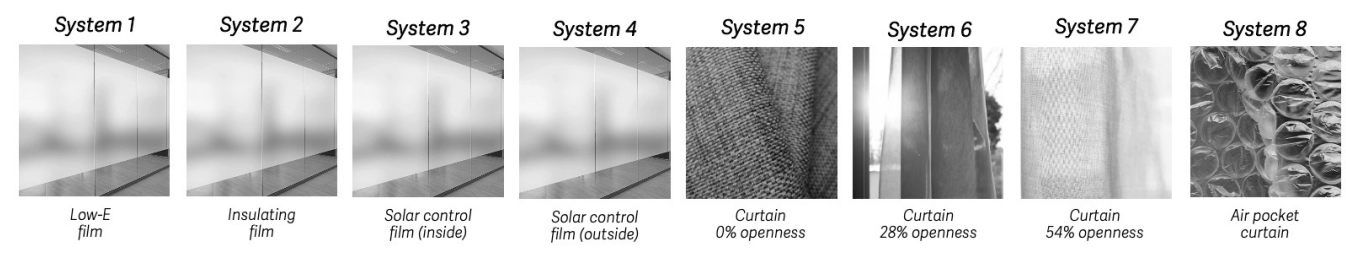
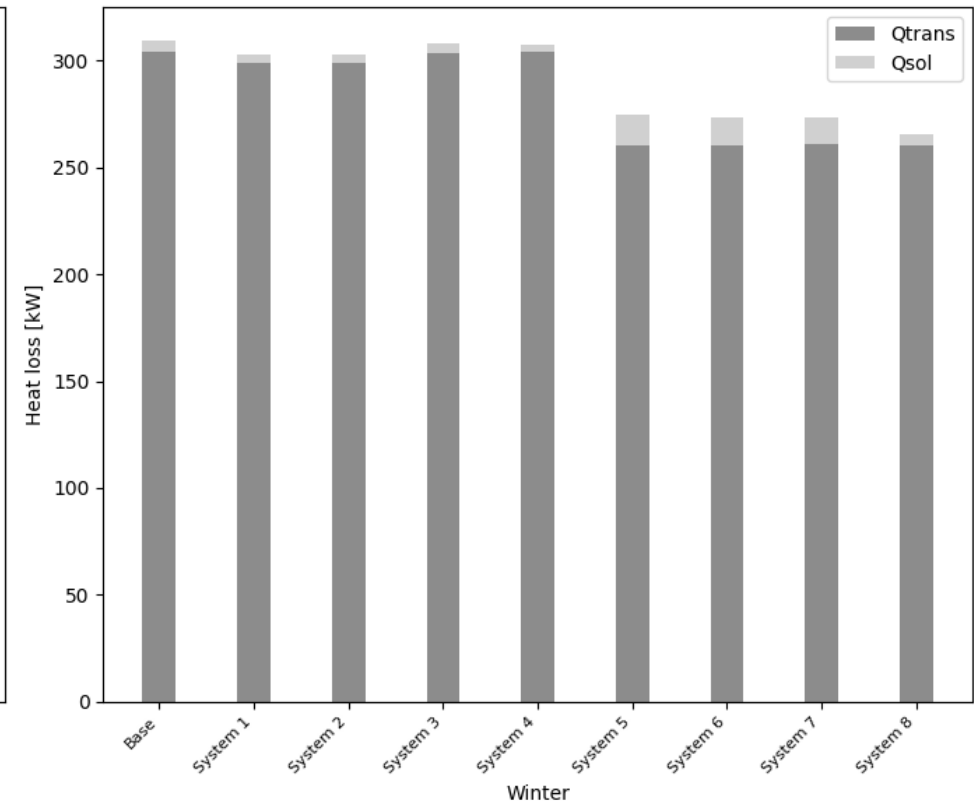
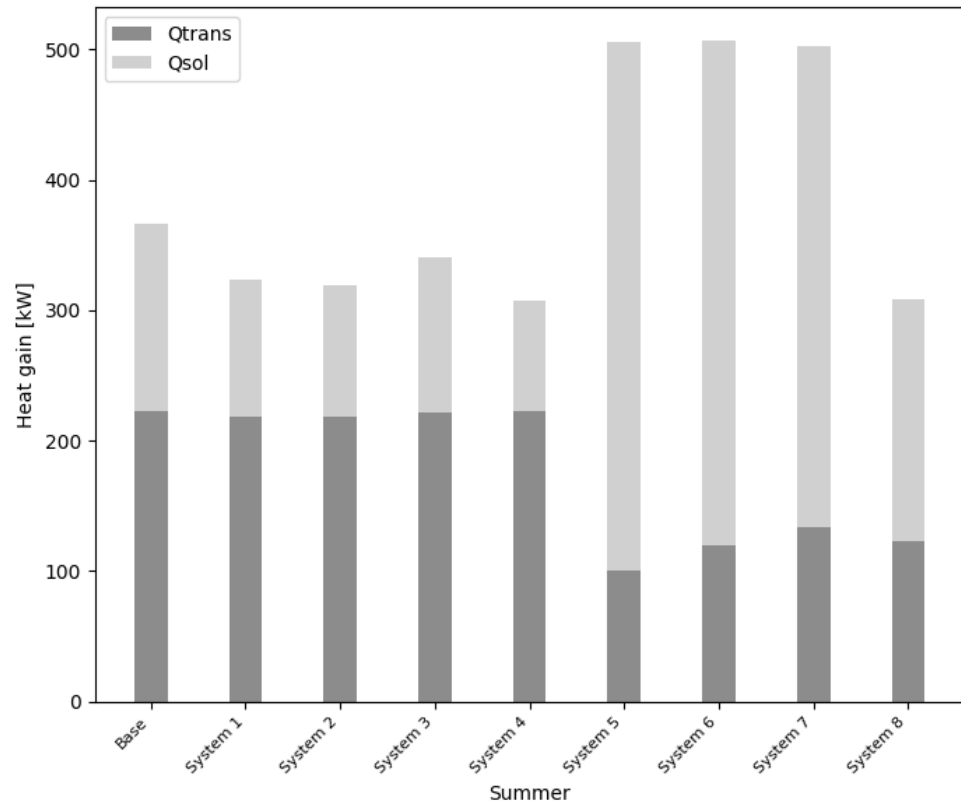
Curtain
54% openness

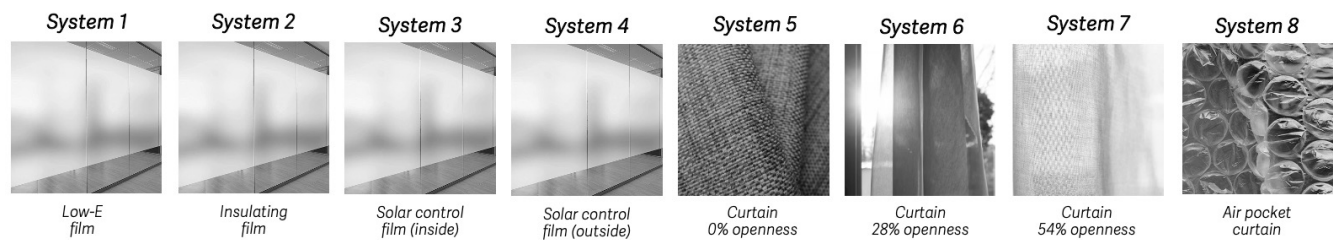
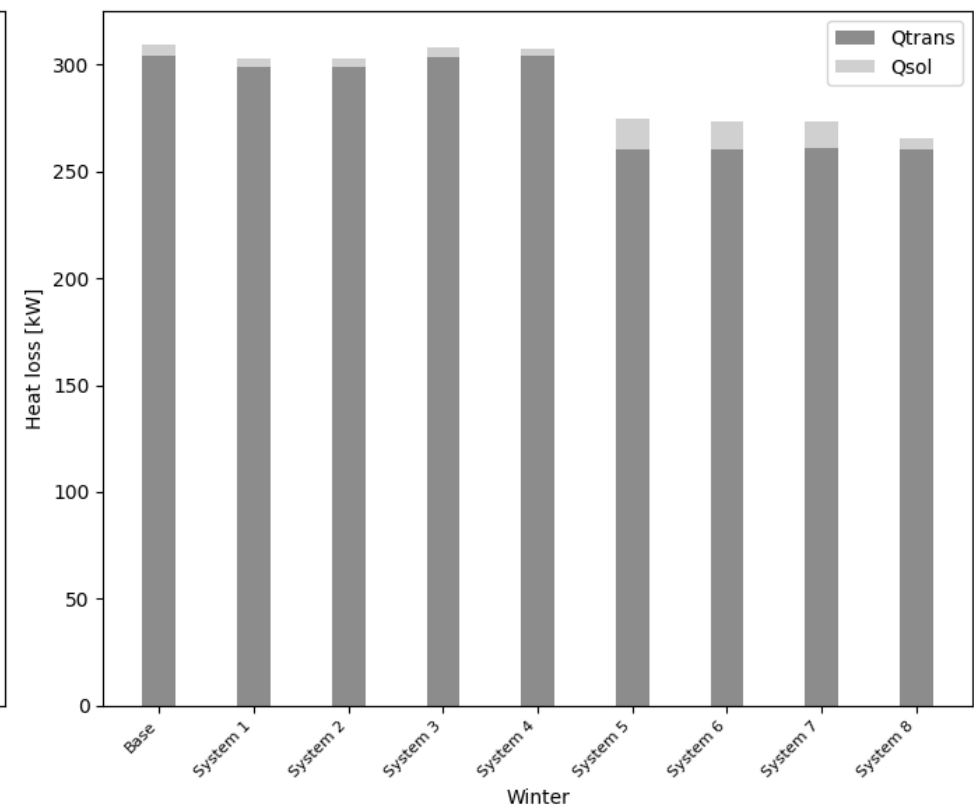
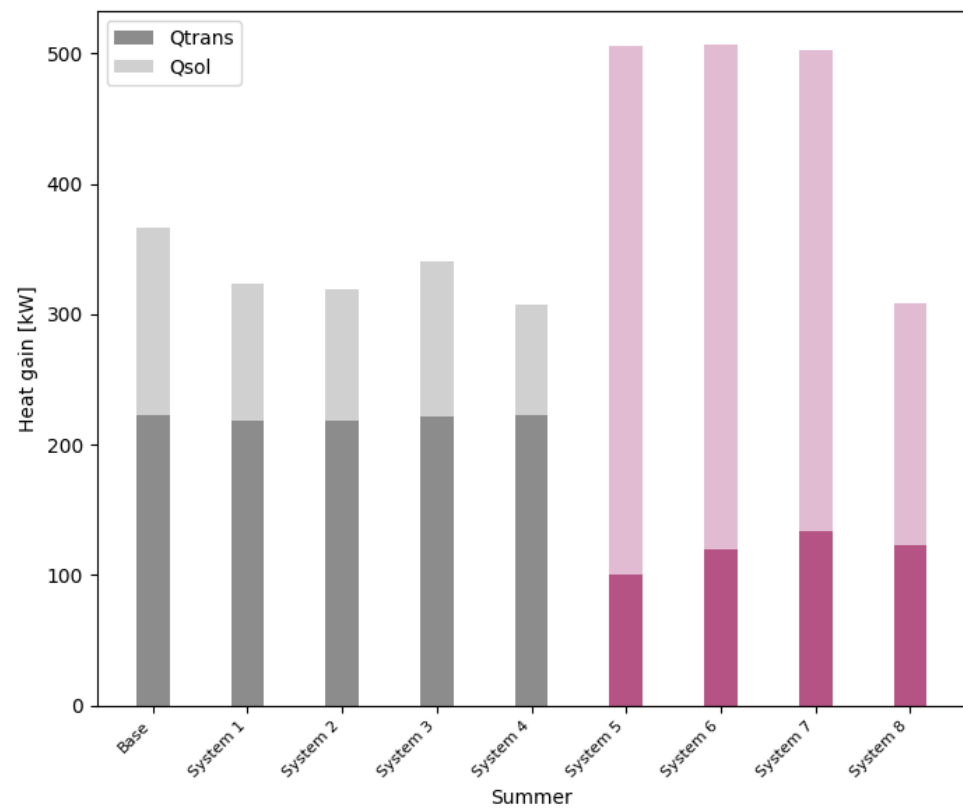
System 8

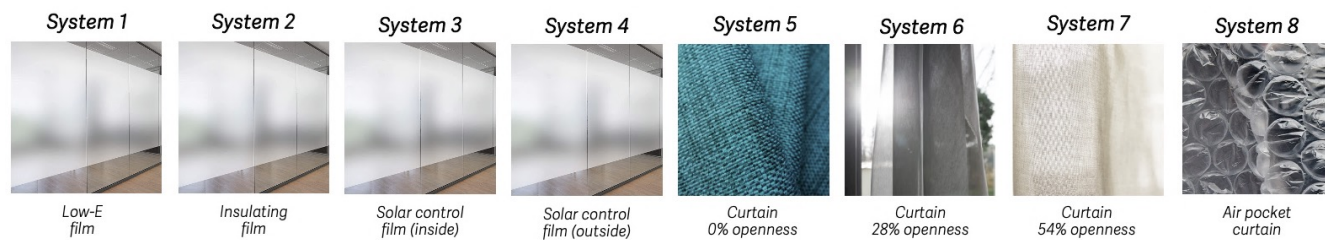
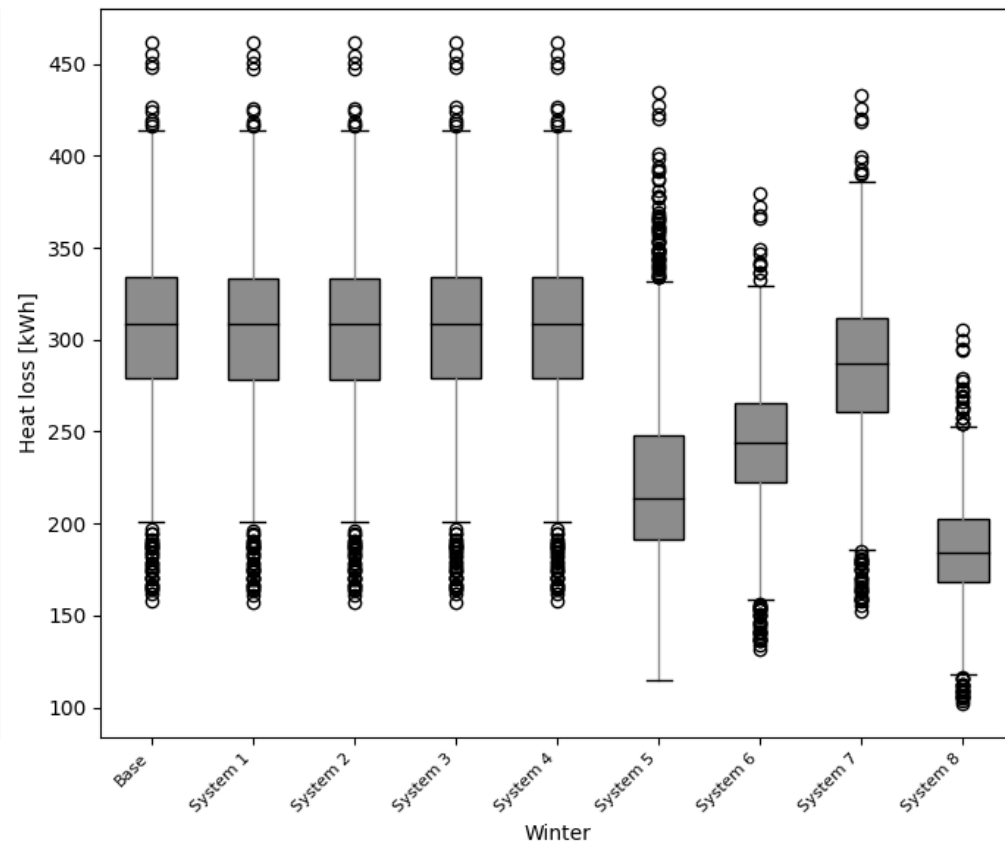
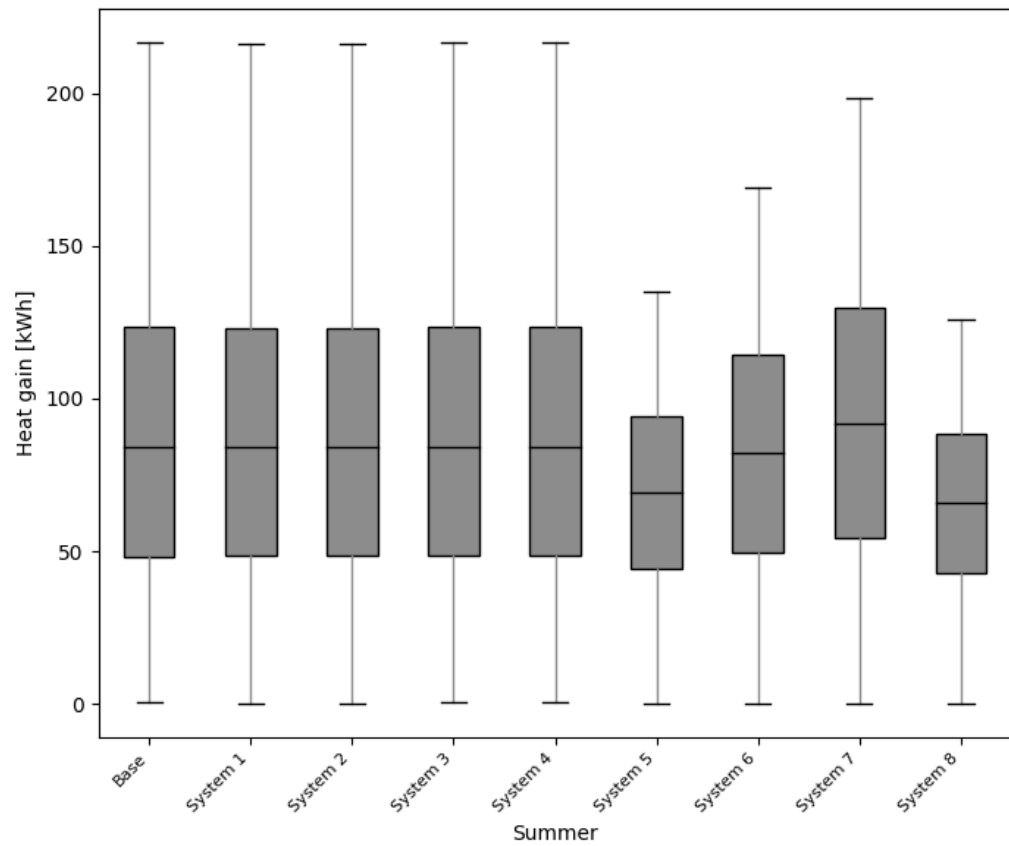


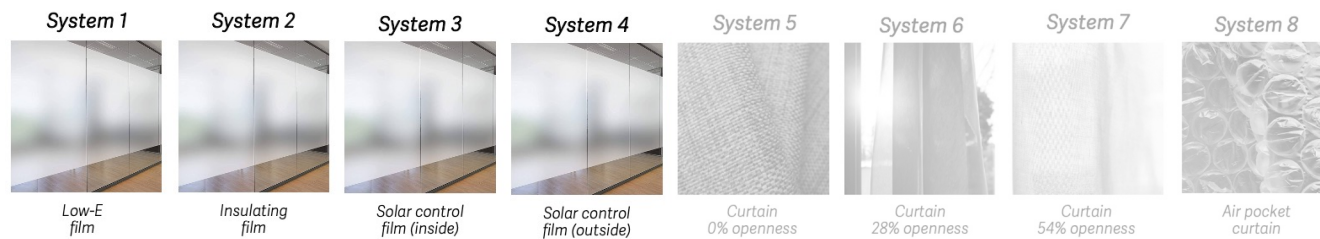
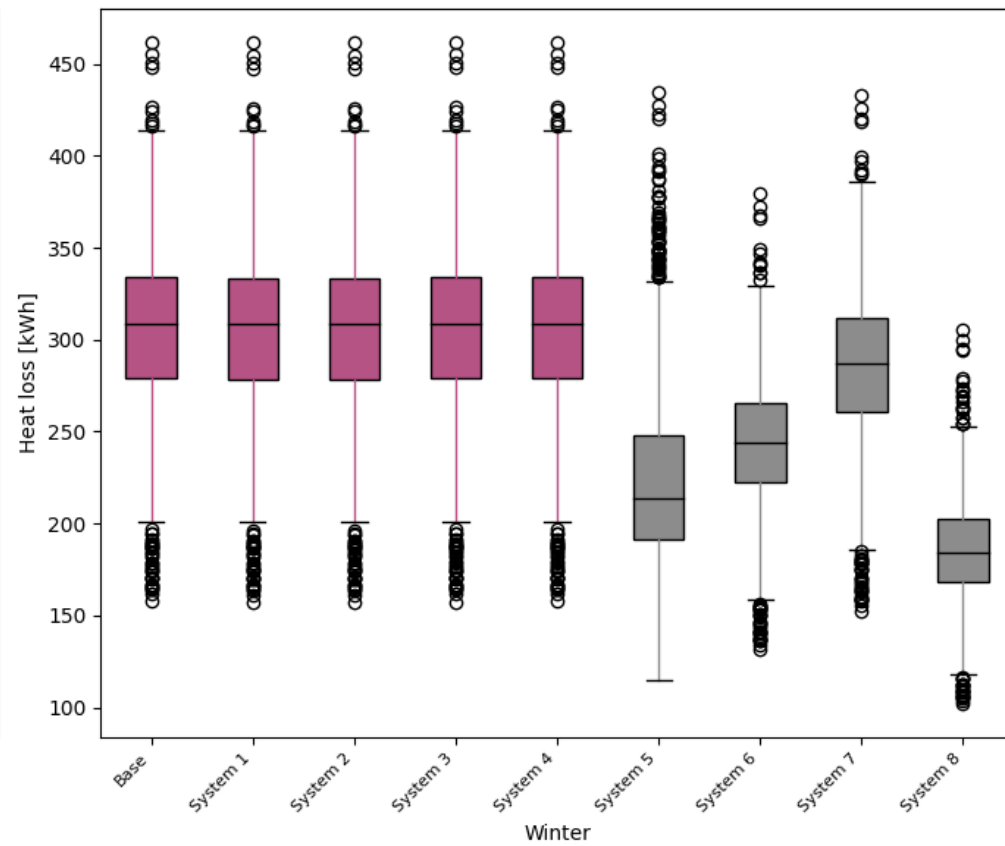
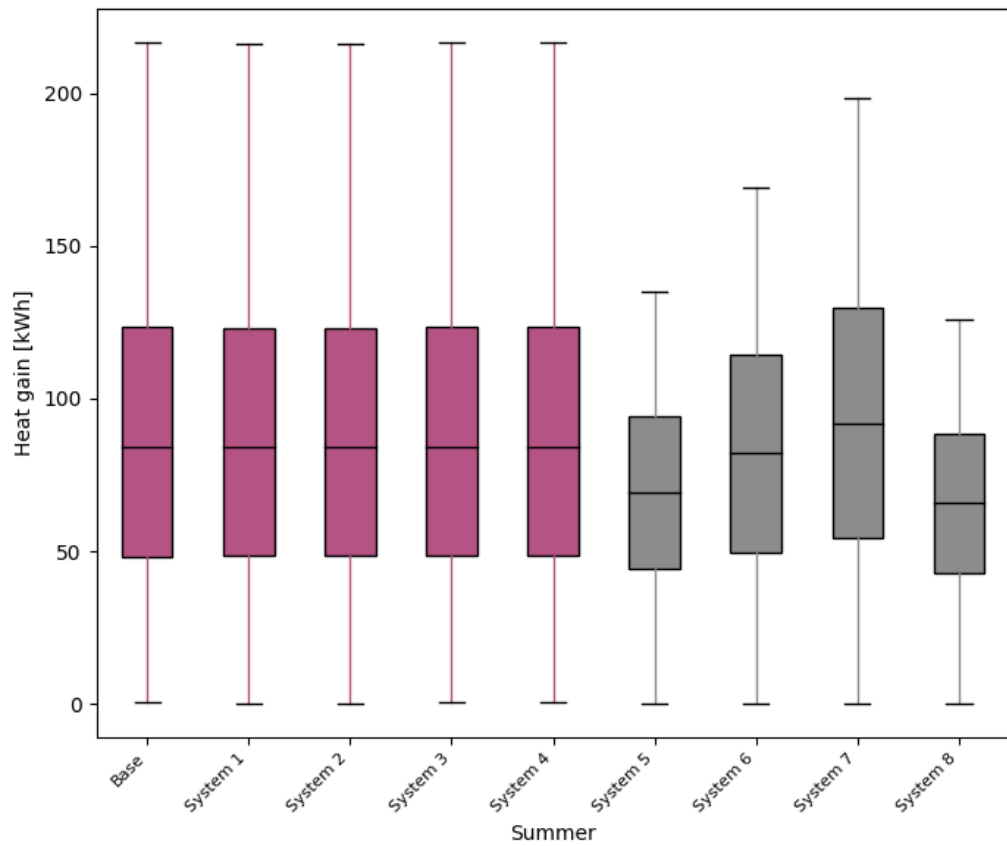
Air pocket
curtain

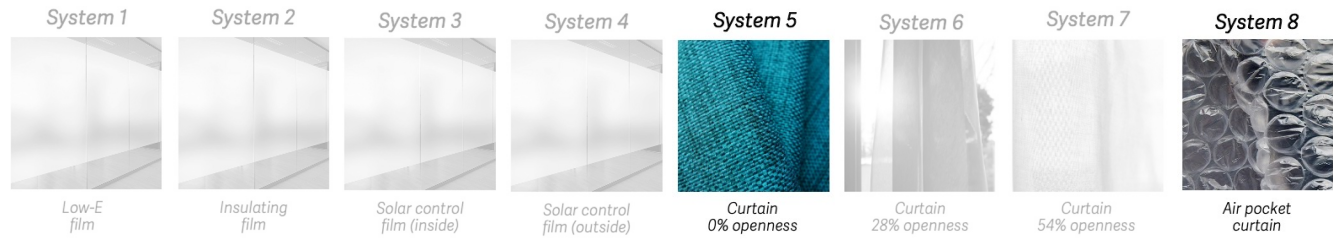
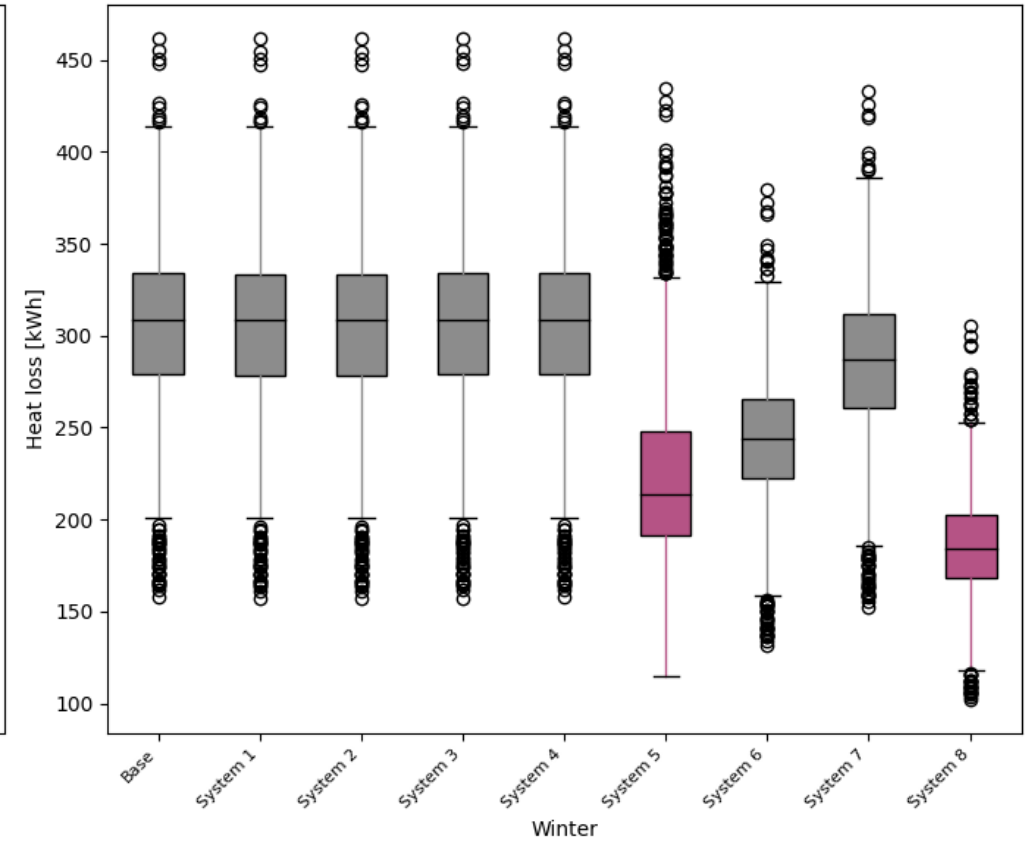
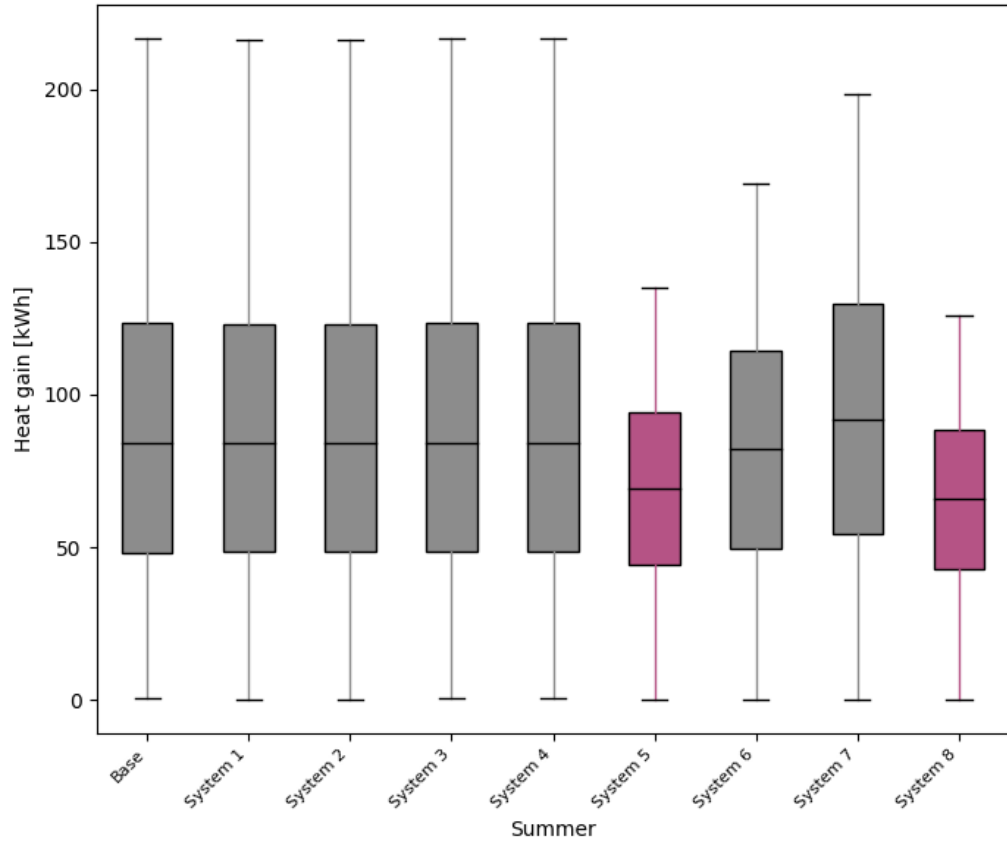
System	Retrofitting Strategies			Window Glass		
	Thickness [m]	U-value [W/m ² K]	Absorption	R [m ² K/W]	U-value [W/m ² K]	SHGC
5	0.003	0.01	0.44	0.606	1.65	0.4
6	0.003	0.3	0.36	0.606	1.65	0.4
7	0.001	0.54	0.3	0.606	1.65	0.4
8	0.127	0.35	0.1	0.606	1.65	0.4

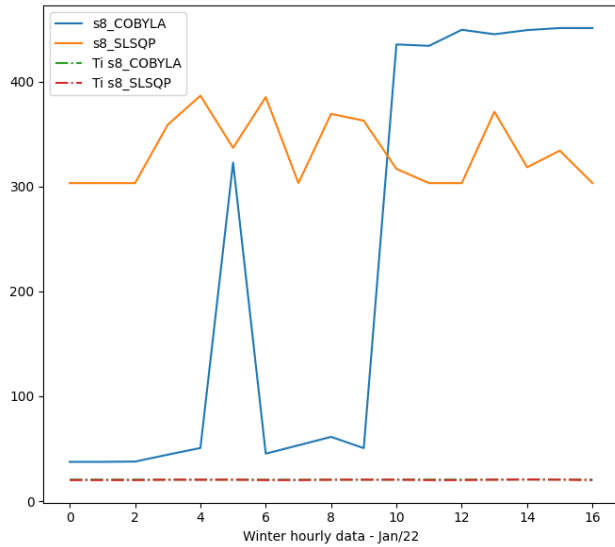
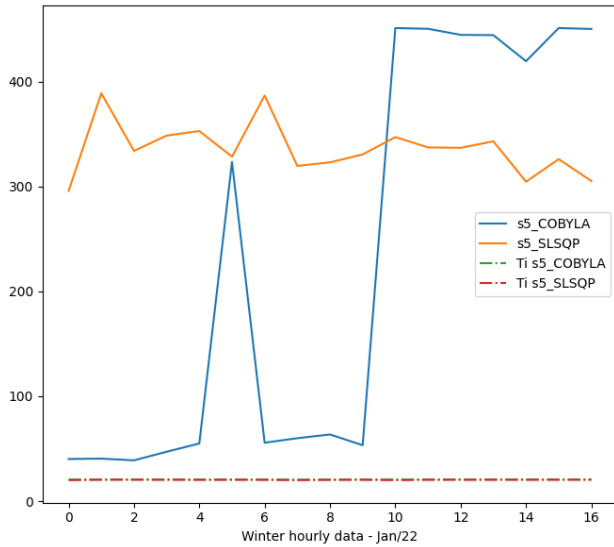
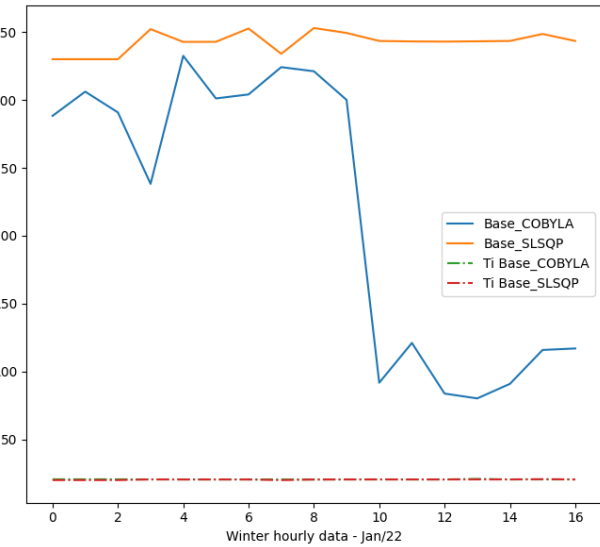
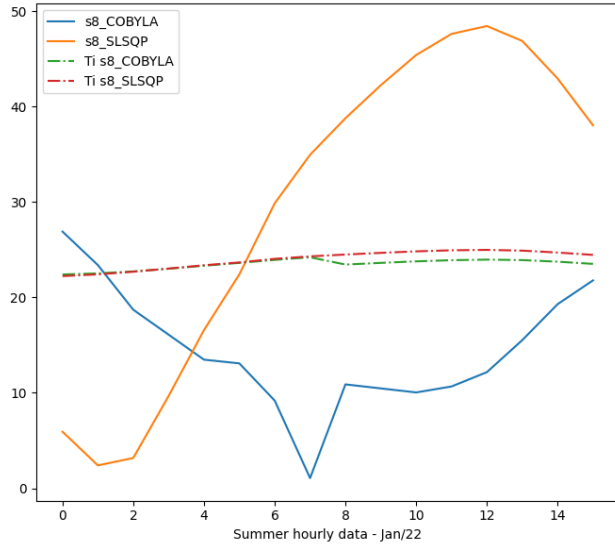
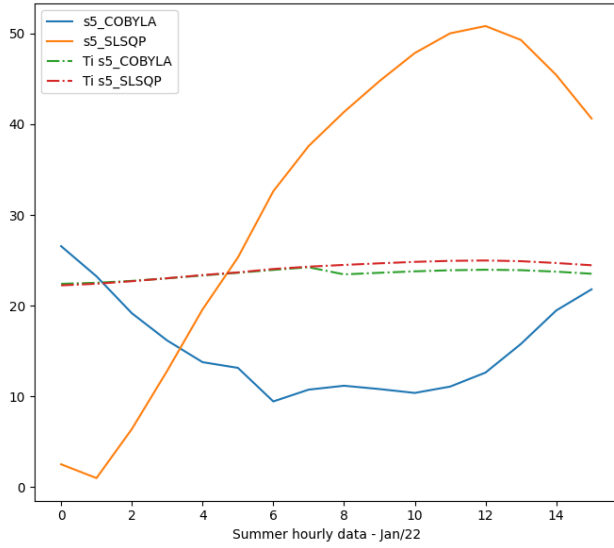
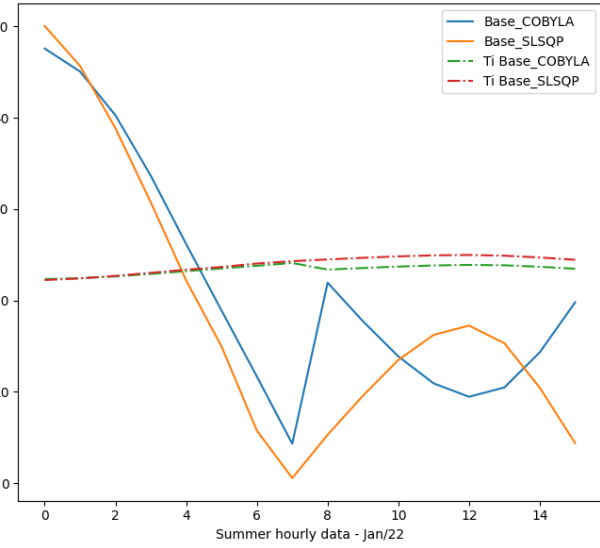






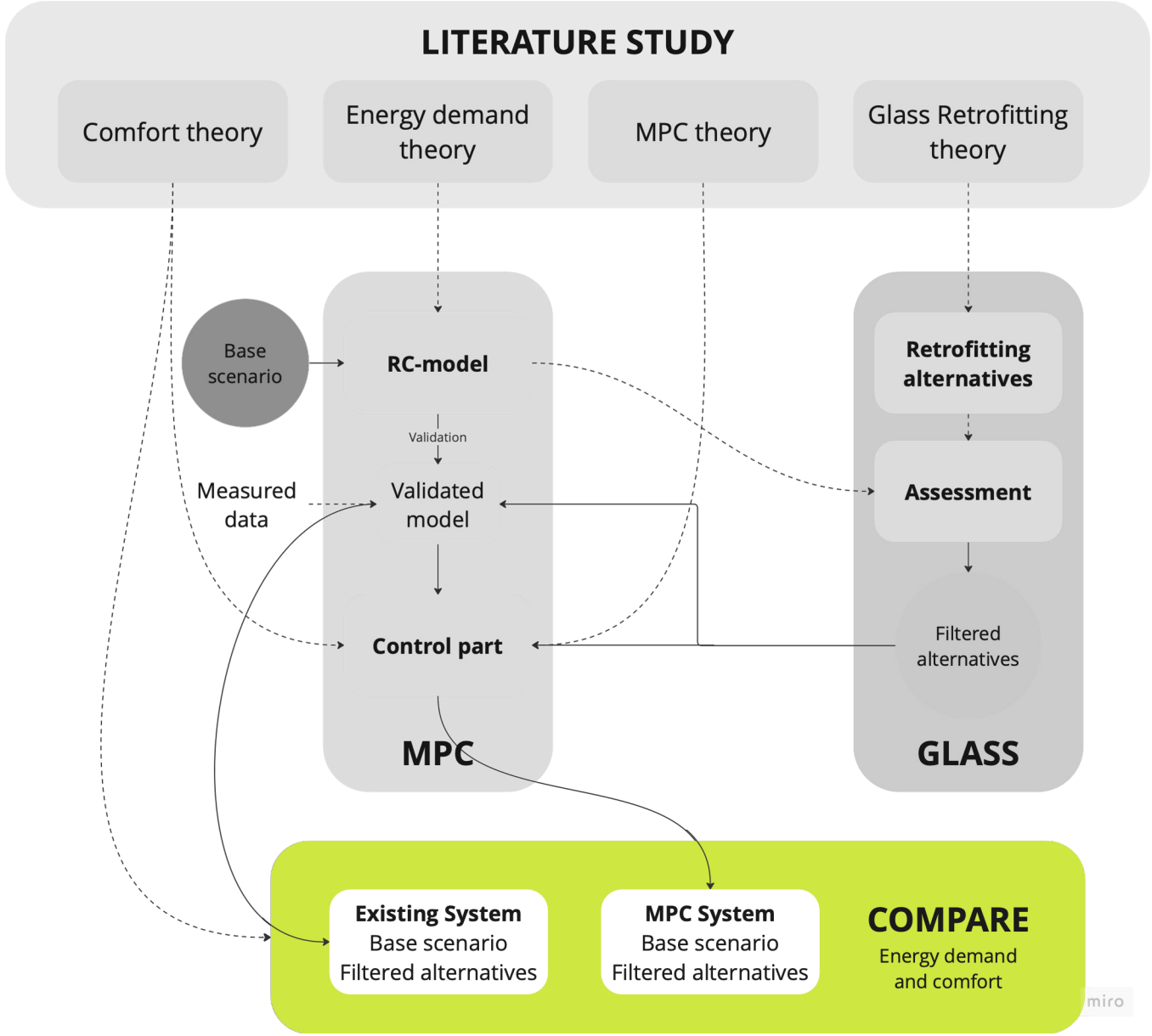


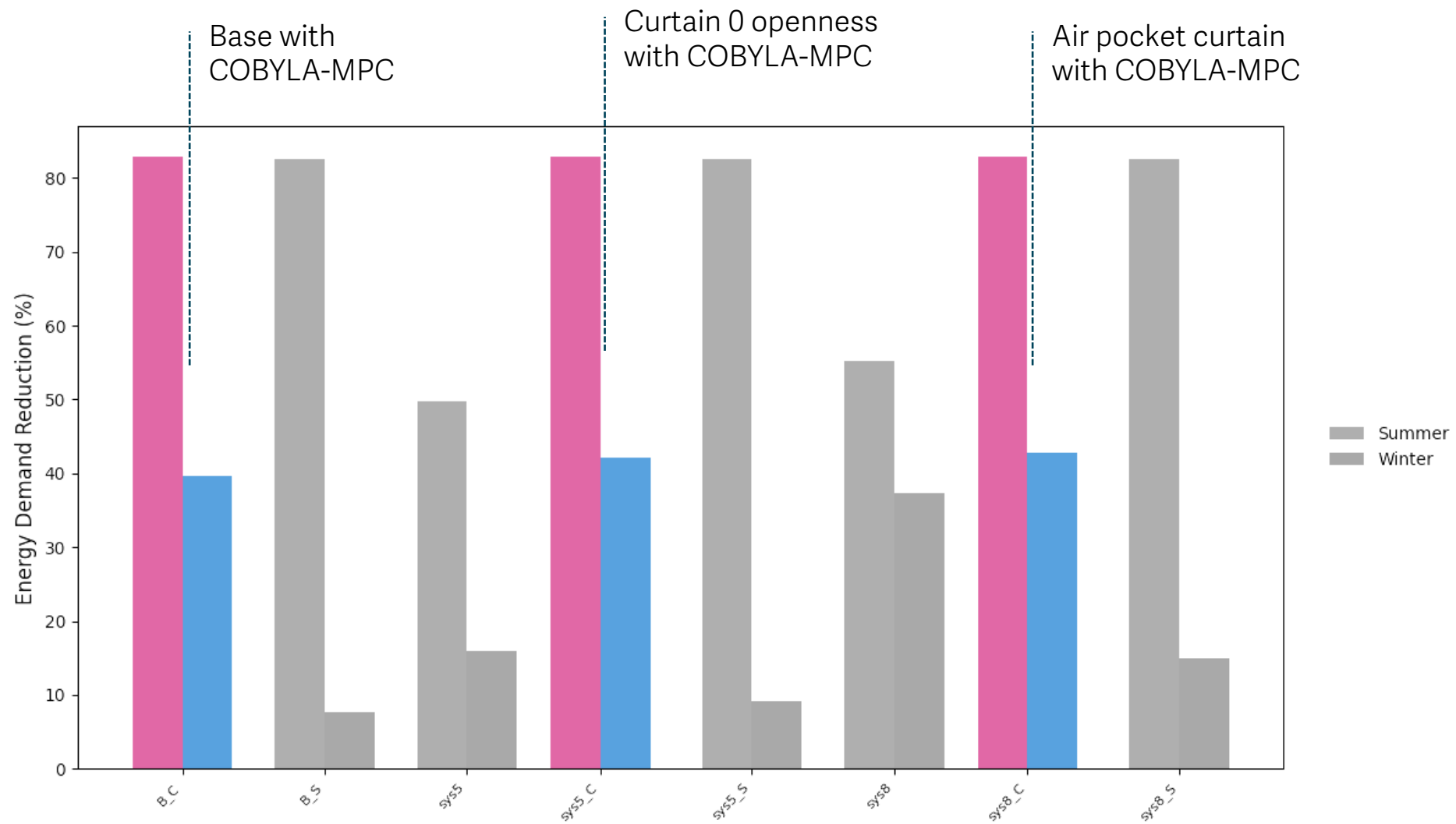




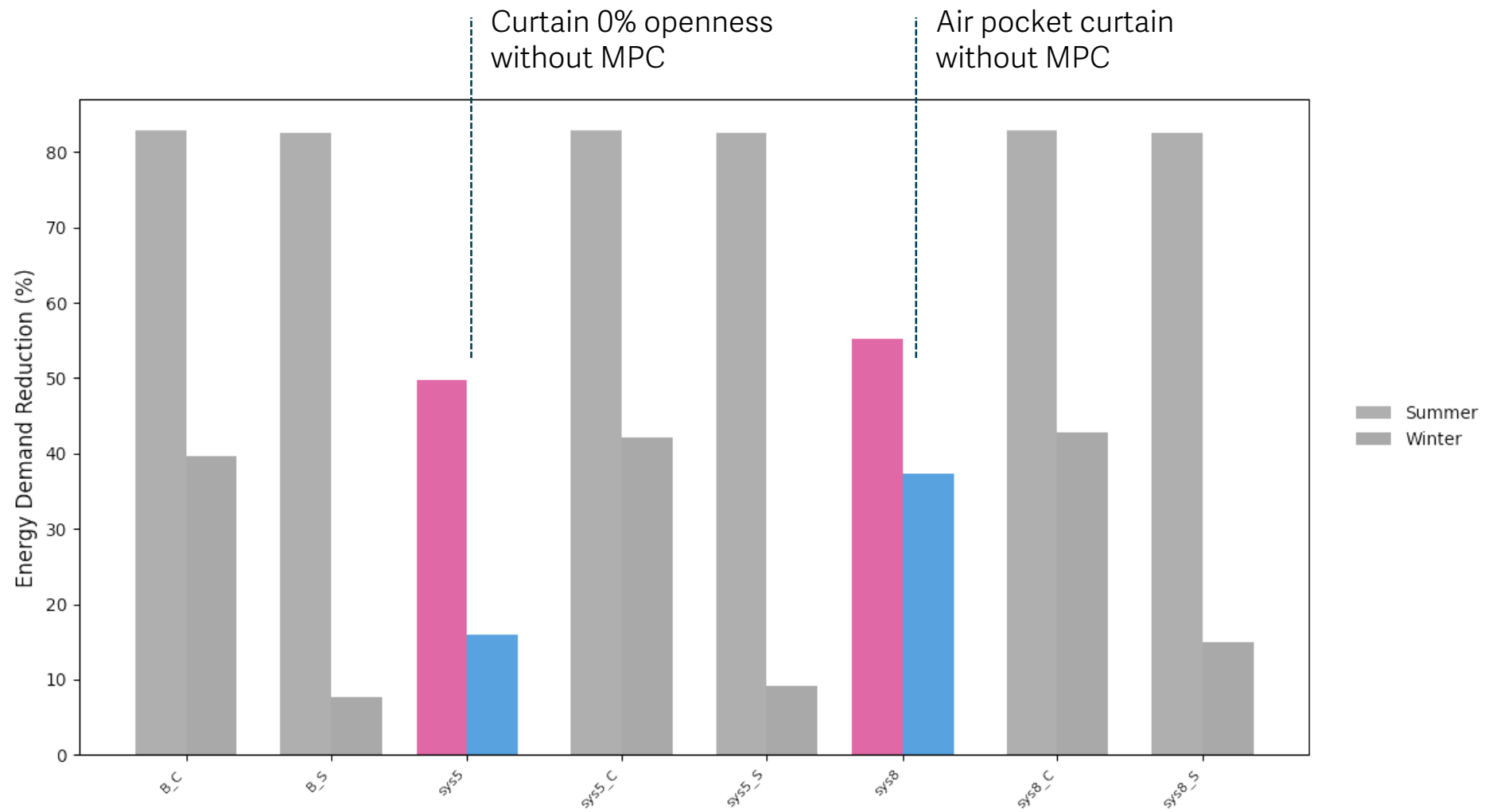
SLSQP tends to prioritize comfort

COBYLA tends to save more energy

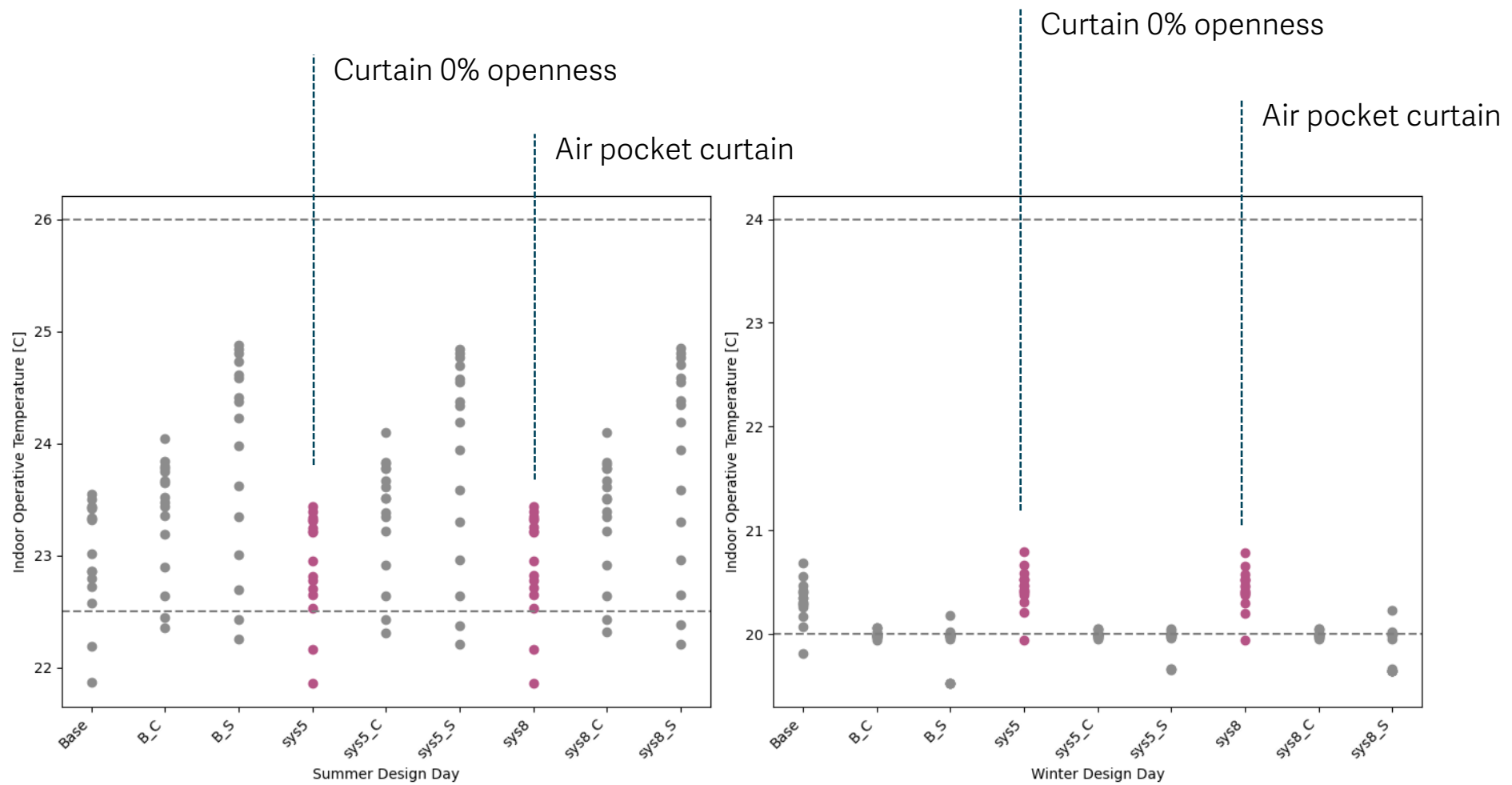




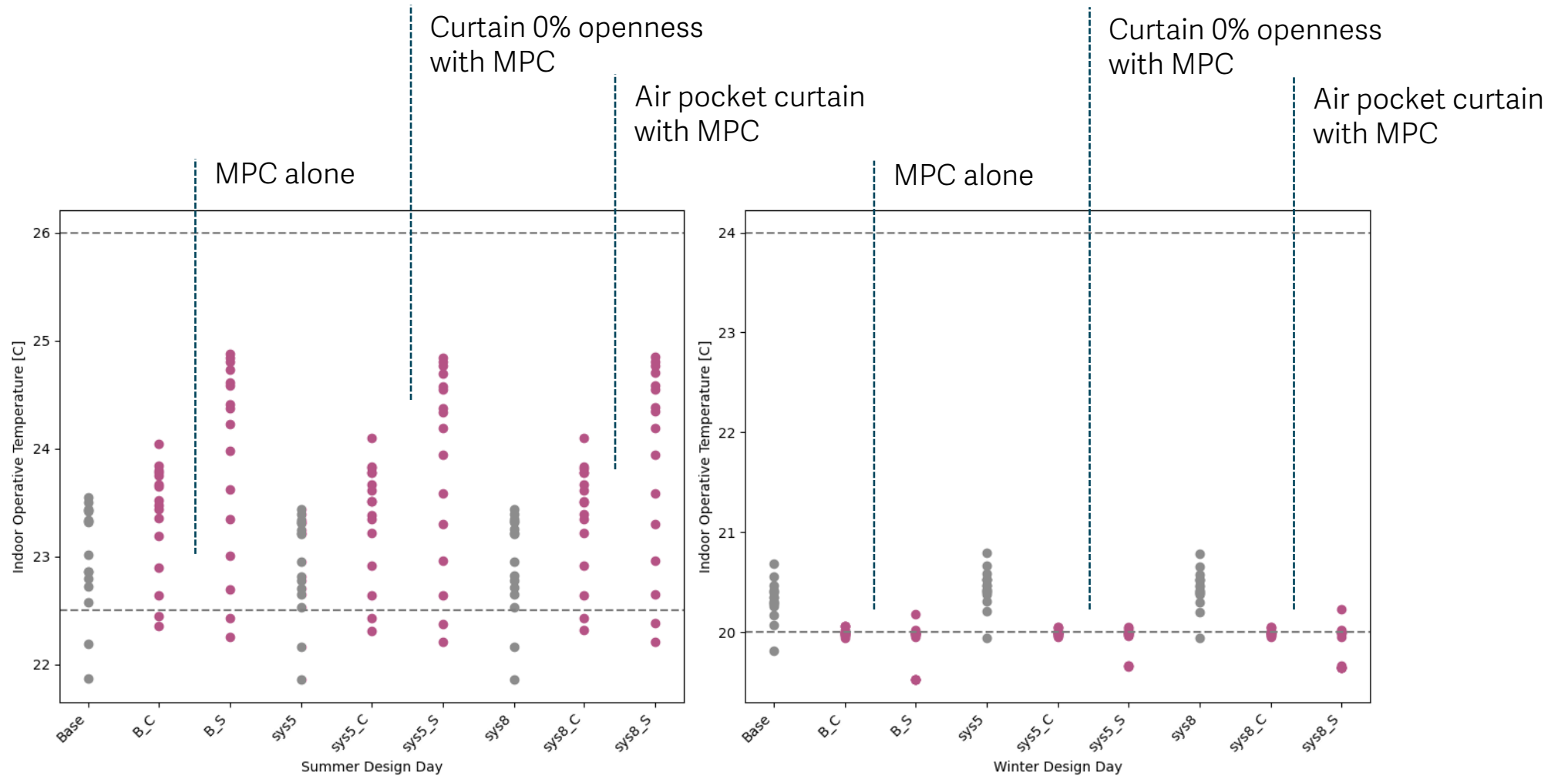
*Systems with COBYLA-MPC are overpowering
in terms of energy saving*



Curtains alone only reduce a low amount of energy demand



Curtains alone are overpowering in terms of thermal comfort

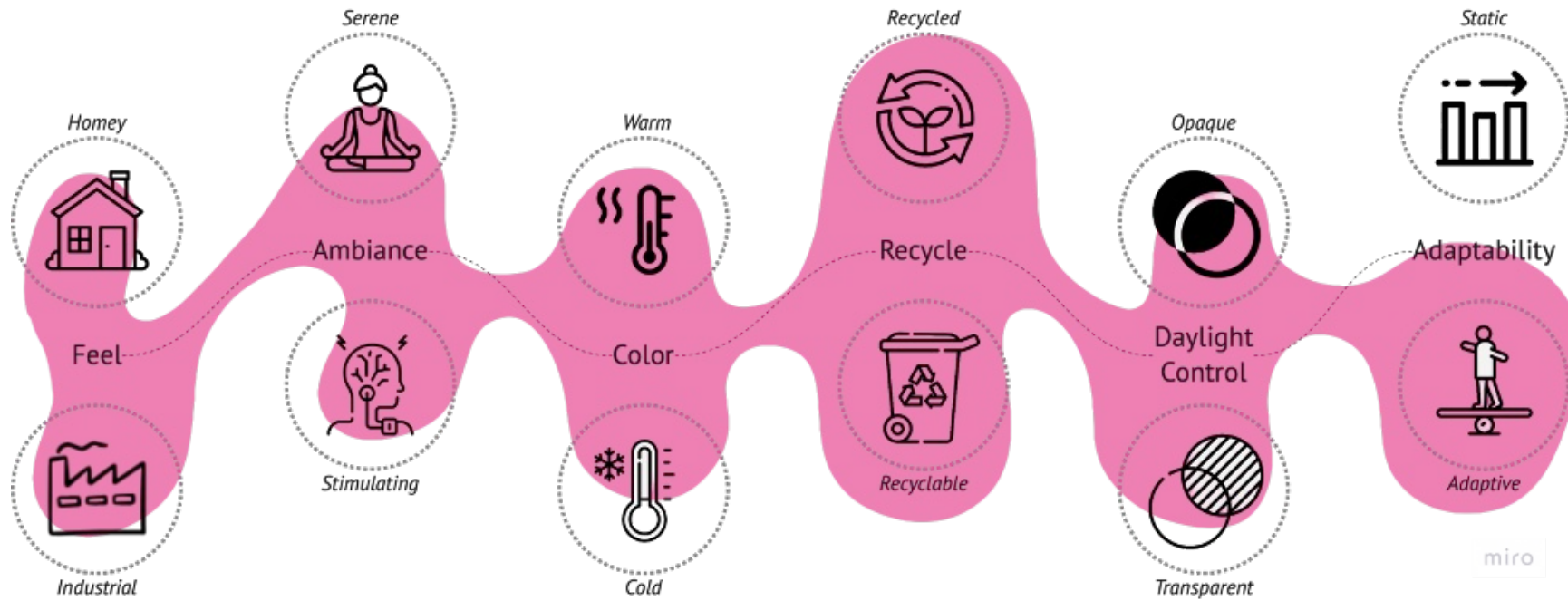


MPC systems are pushing towards the comfort limits

Trade off

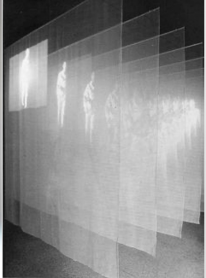
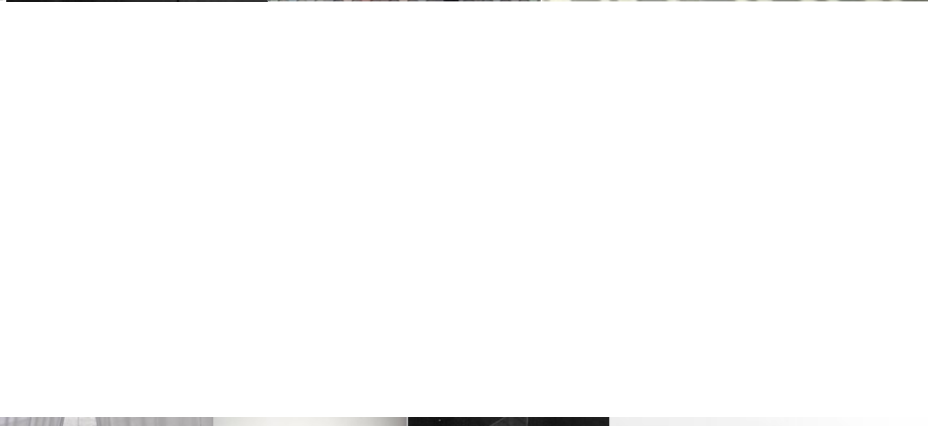
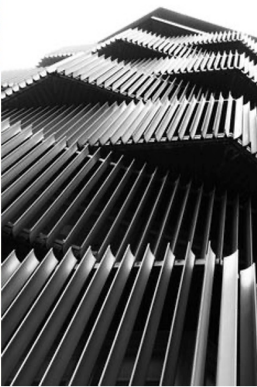
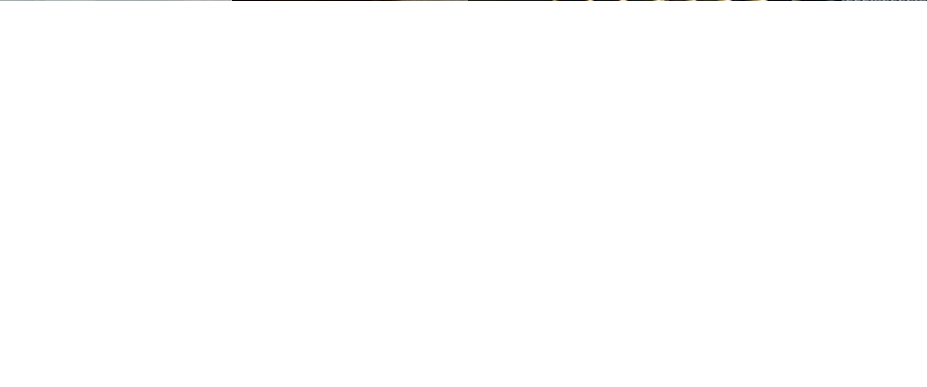
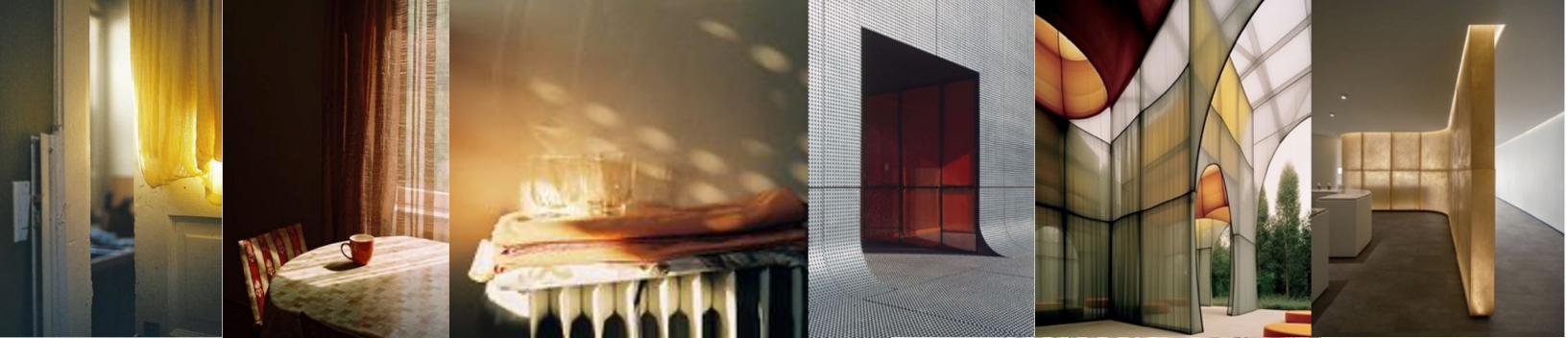


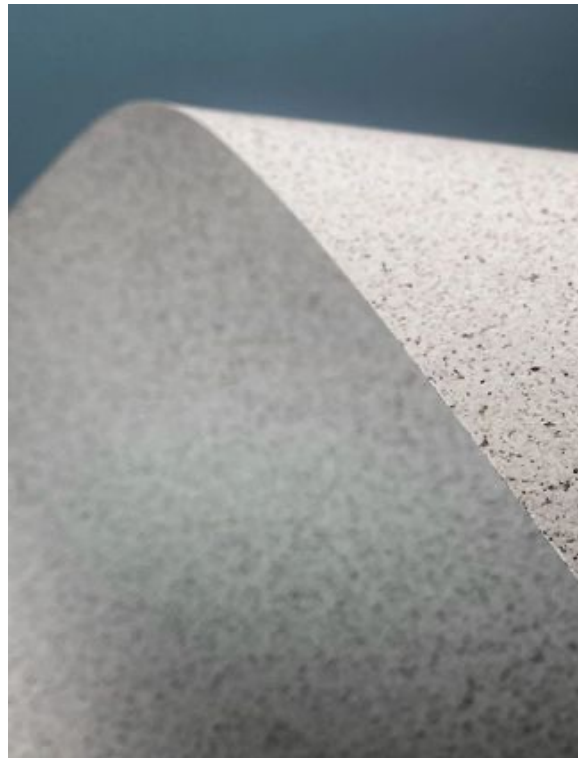
If I were to fix Pulse...



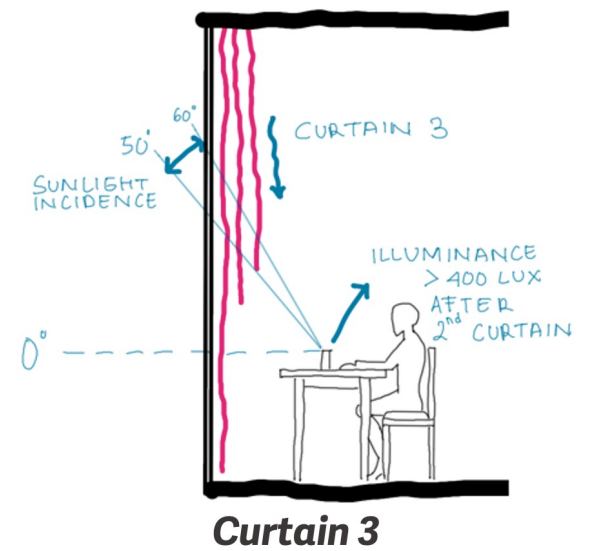
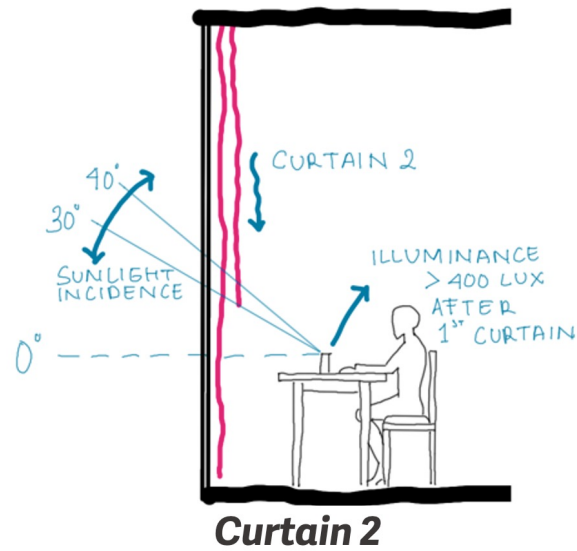
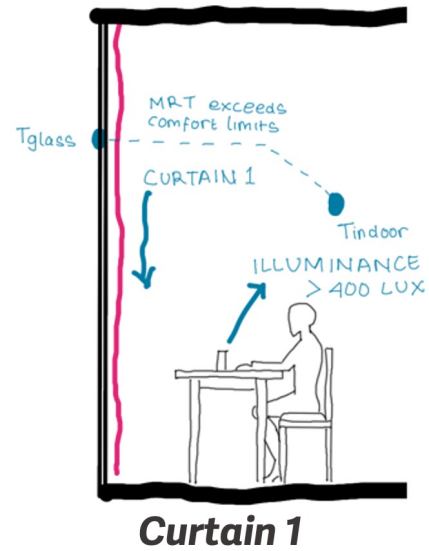
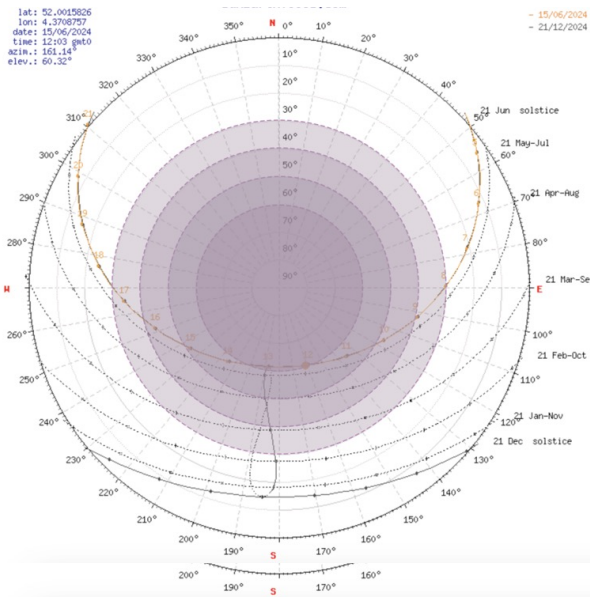
miro

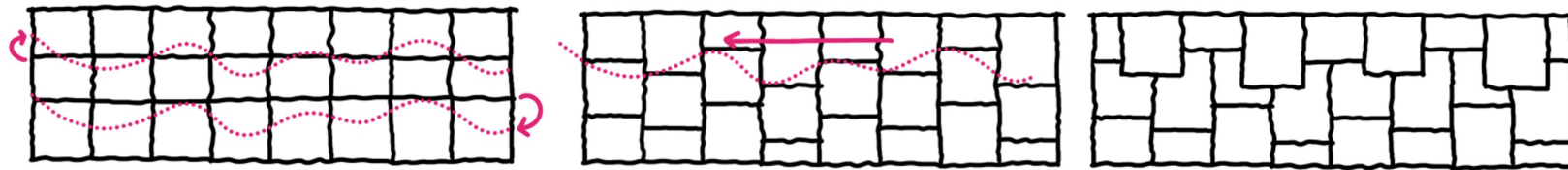
○ Not selected ● Selected ◐ In between ●● Both





Recycled Papers

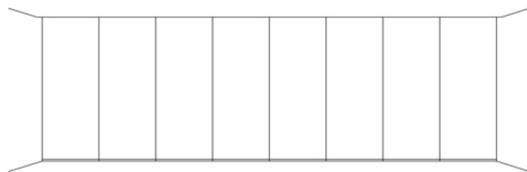




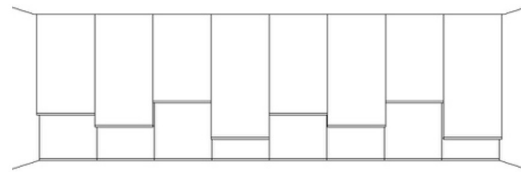
Step 1

Step 2

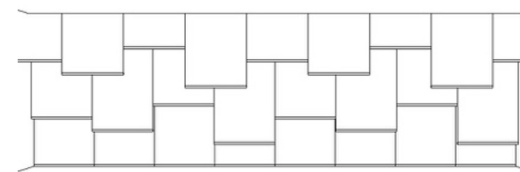
Step 3



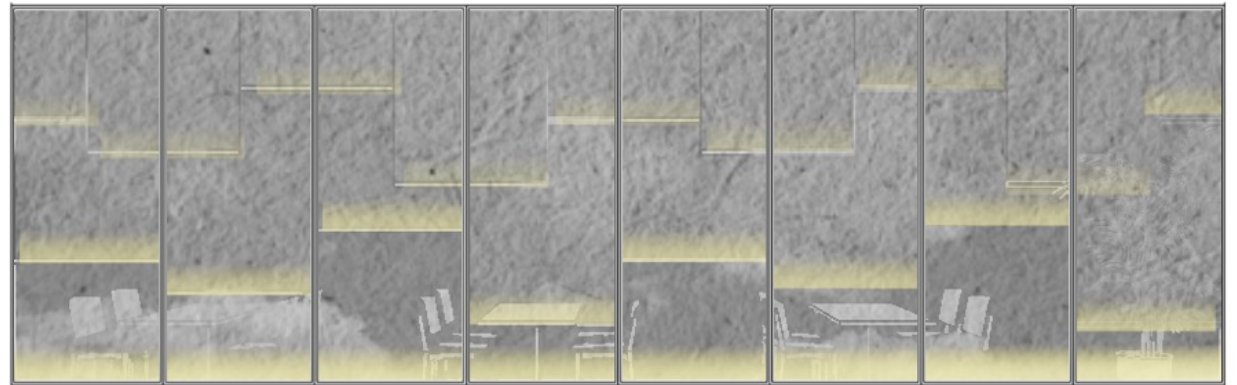
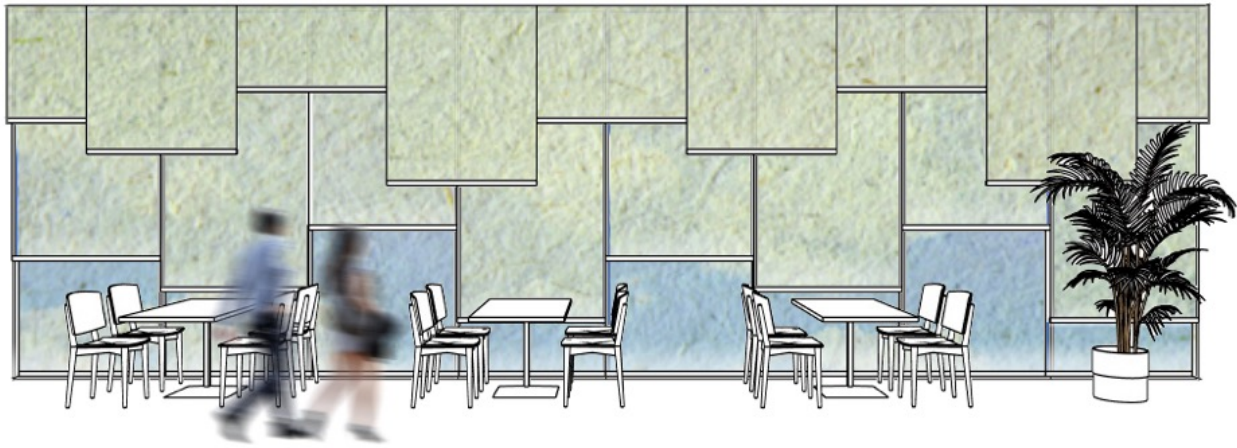
Layer 1



Layer 2



Layer 3



Recap.

['ri:kap] *verb.*

state again as a summary; recapitulate.

Lumped model works, but it has limitations

Lumped model works, but it has limitations

Algorithms behave differently, choose wisely

Lumped model works, but it has limitations

Algorithms behave differently, choose wisely

A **trade-off** consequences

Lumped model works, but it has limitations

Algorithms behave differently, choose wisely

A **trade-off** consequences

Simple retrofitting strategies can work

At the end of the day, it's all about priority.

Smart system is to save energy; retrofitting strategies are to improve comfort.

Use both to help complement each other.

Thank you!