



MPC - Modelica System Integration

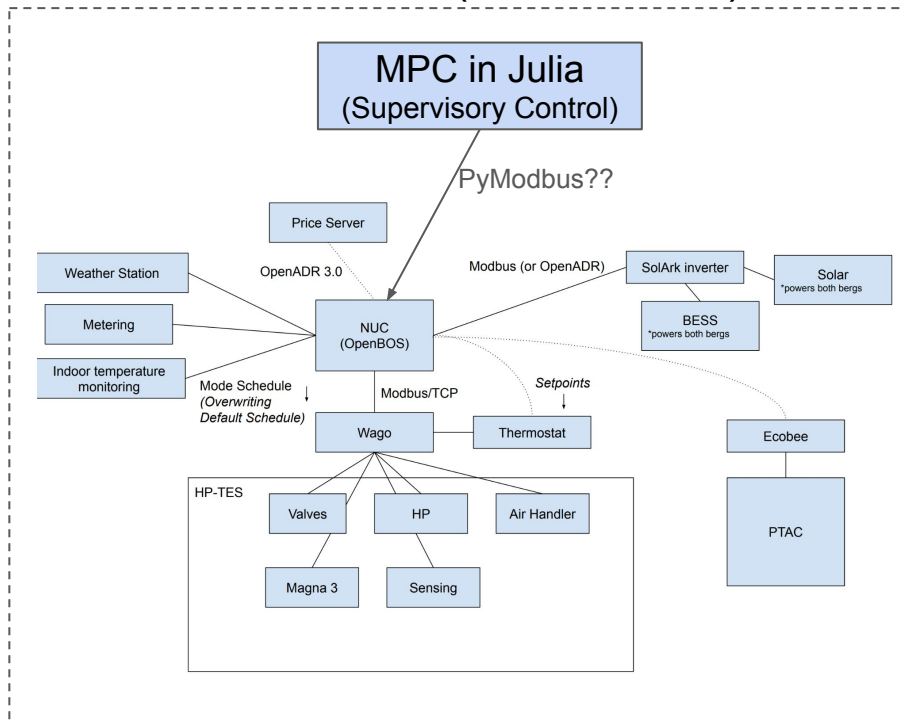
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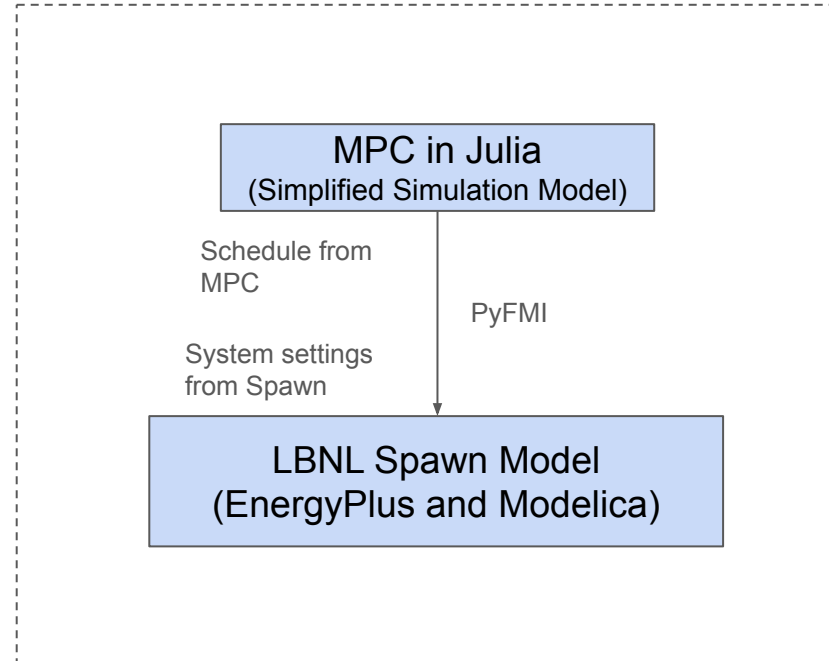
Big Picture

Real-Time (credit: Lazlo)



Real Berg Structure

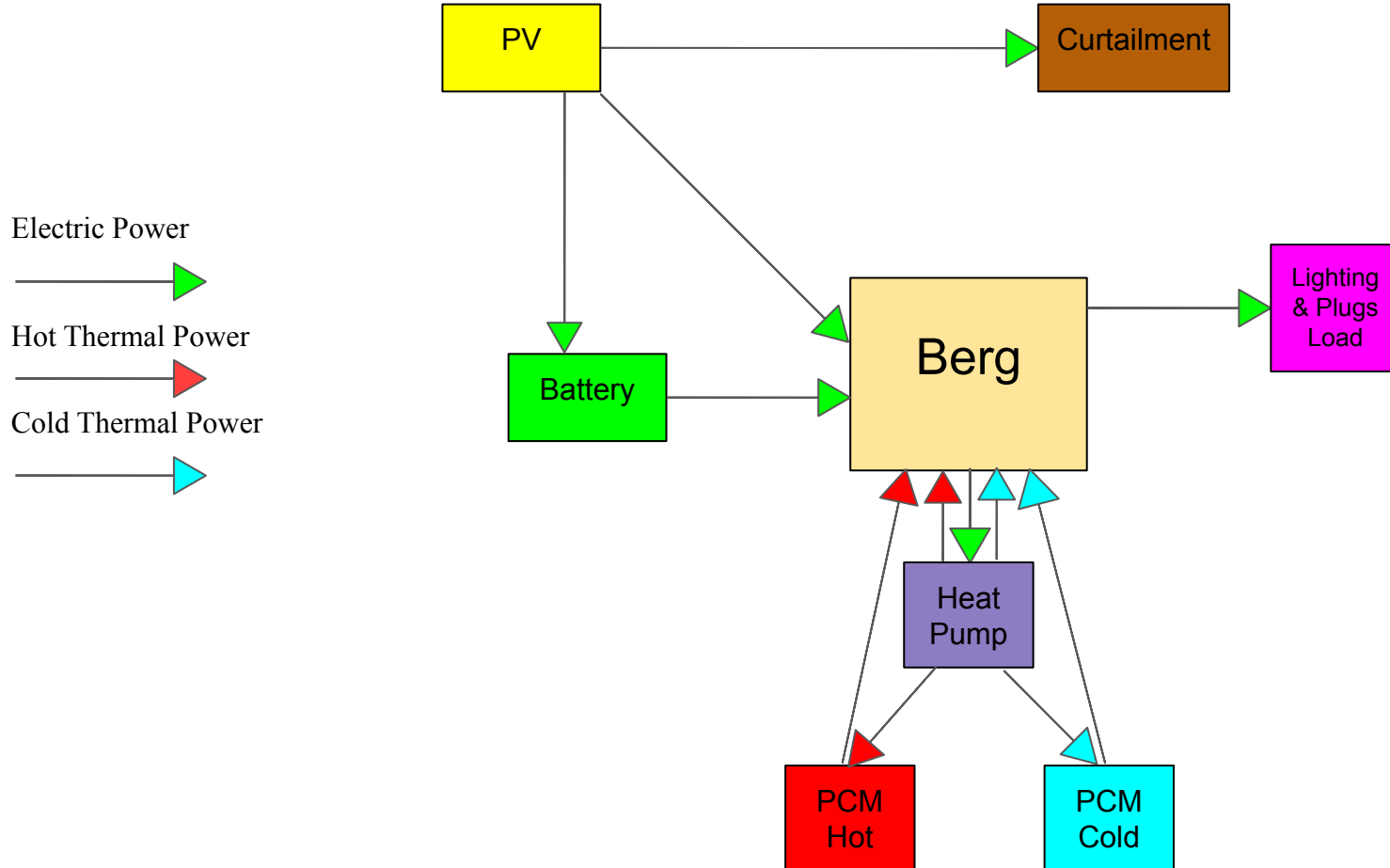
Simulation



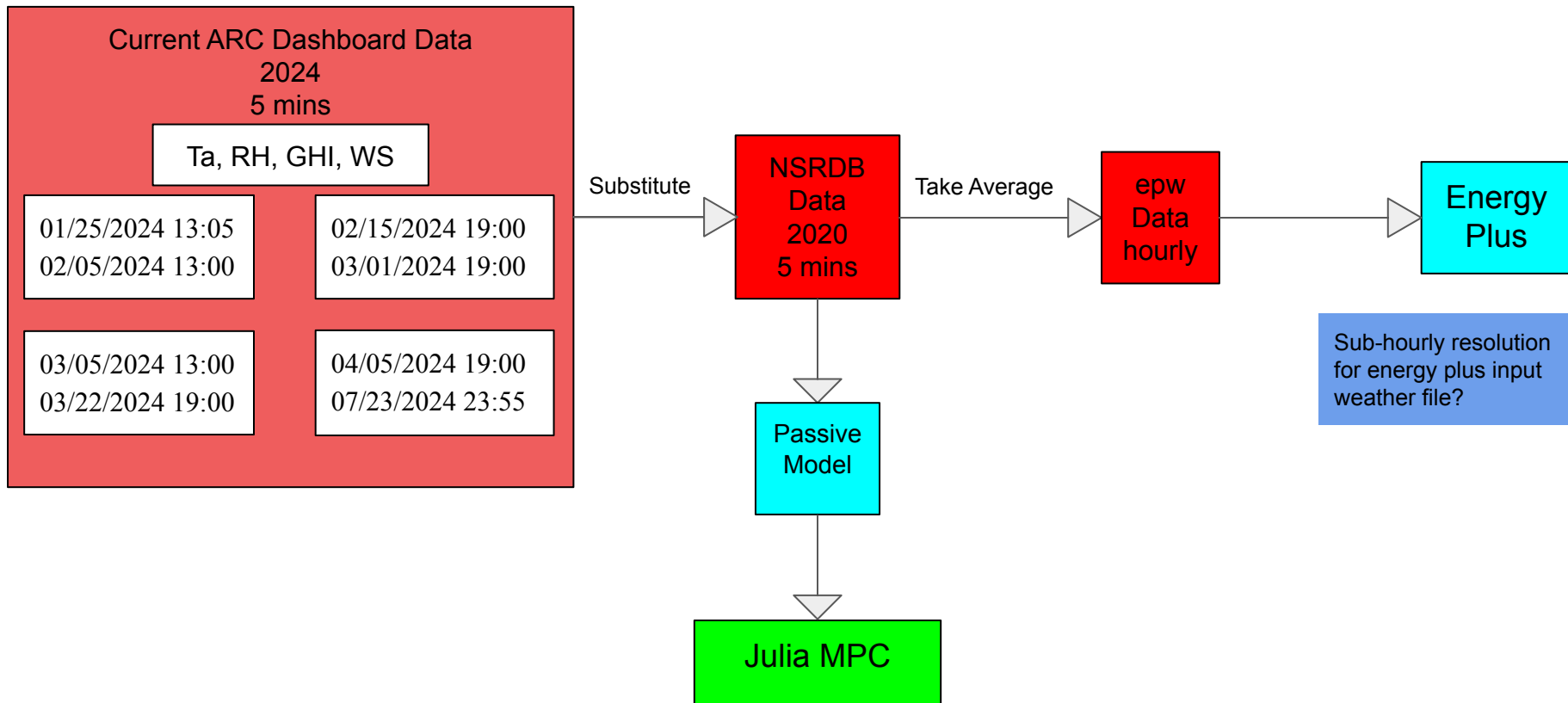
Modeled Berg Envelope in Energy Plus

Modeled HP-TES in Modelica

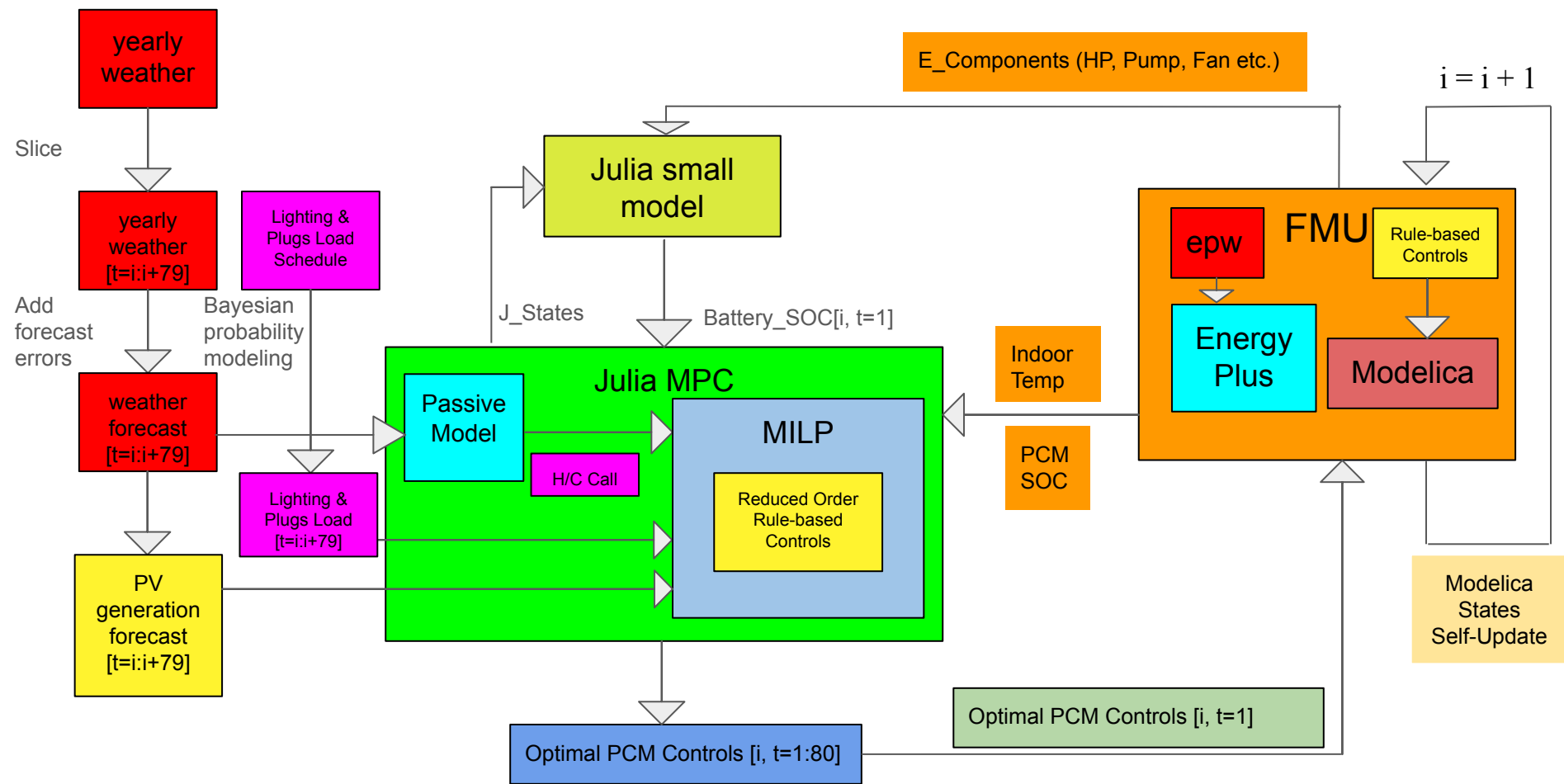
Physical System Layout



Data



Integrated Model Structure



MPC Time Interval

Interval Type	Interval Length	# of Intervals	Length	Aggregated Horizon	Aggregated # of Intervals
1	5 mins	6	0.5 hours	0.5 hours	6
2	30 mins	5	2.5 hours	3 hours	11
3	1 hour	21	21 hours	1 day	32
4	2 hours	48	96 hours	5 days	80

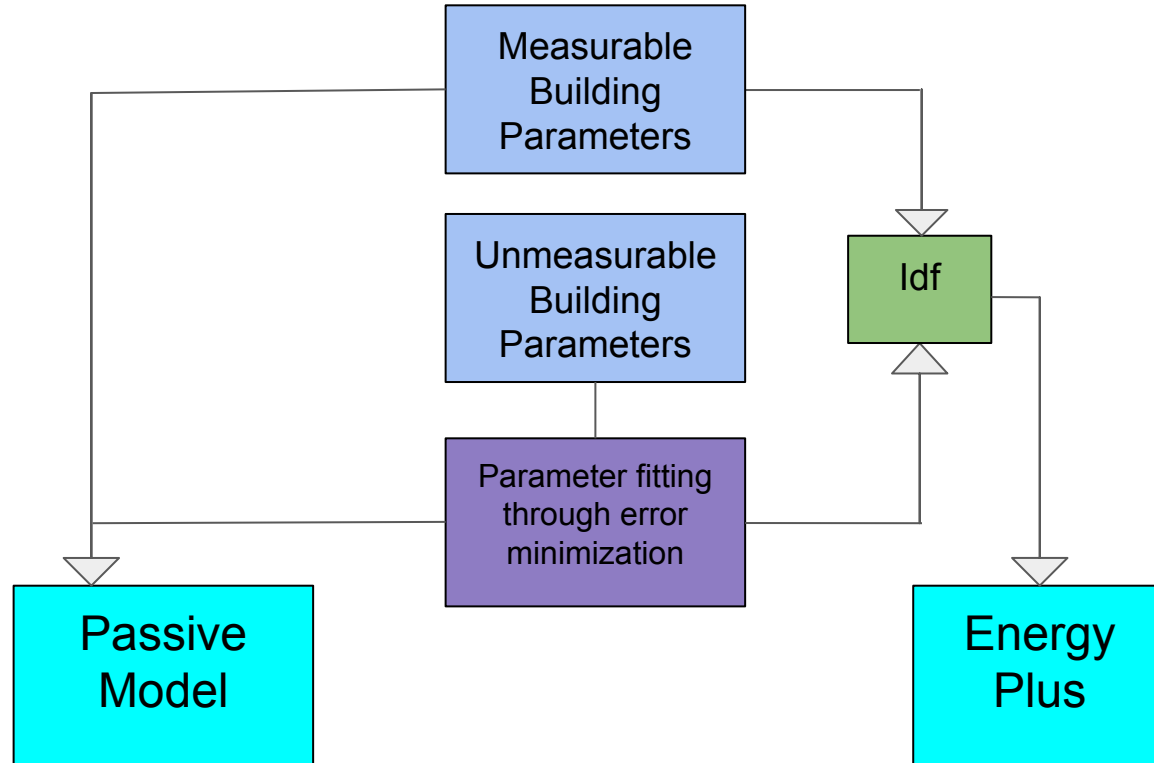
Model Time Definition

MPC Time Step			
	Iteration i = 0	Iteration i = 1	Iteration i = 2
Mode	Start FMU first; Run FMU with default command	Start MPC, optimize, send command to FMU	Run FMU with MPC command; Re-run MPC, optimize, send command to FMU
Current Time	0:00	0:00	0:05
MPC Model t=1	/	0:05	0:10
Solve Time	/	00:00 to 00:05	00:05 to 00:10
Weather Input	/	Weather forecast at 00:00 of horizon starting at 00:05	Weather forecast at 00:05 of horizon starting at 00:10
M_States[t=1]	Initial_M_States used to start the FMU	M_States[t=1, i=1] = M_States output from (i = 0)	M_States[t=1, i=2] = M_States[t=2, i=1] at 00:10, or between 00:05 to 00:10
J_States[t=1]	/	J_States[t=1, i=1] = Initial J_States	J_States[t=1, i=2] = J_States[t=2, i=1] at 00:10, or between 00:05 to 00:10
Current Action	/	Nothing: from 00:00 to 00:05	D[t=1, i=1]: from 00:05 to 00:10
Next Optimal Decision	Nothing: from 00:00 to 00:05	D[t=1, i=1]: from 00:05 to 00:10	D[t=1, i=2]: from 00:10 to 00:15
M_States output	Initial_M_States after doing nothing for 5 minutes	M_States[t=2, i=1] at 00:10, or between 00:05 to 00:10	M_States[t=2, i=2] at 00:15, or between 00:10 to 00:15
J_States output	/	J_States[t=2, i=1] at 00:10, or between 00:05 to 00:10	J_States[t=2, i=2] at 00:15, or between 00:10 to 00:15
time points for FMU	[00:00, 00:05]	[00:05, 00:10]	[00:10, 00:15]
PV_Gen_0	/	PV Generation from 00:00 to 00:05	PV Generation from 00:05 to 00:10
Battery_SOC_0	/	Battery SOC at 00:00	Battery SOC at 00:05 (InStorageBattery_past[1])
Battery_SOC[t=1]	/	Battery SOC at 00:05	Battery SOC at 00:10 (InStorageBattery_past[2])
PV2B[t=1]	/	PV2B[t=1, i=1] = Average POWER from 00:05 to 00:10	PV2B[t=1, i=2] = Average POWER from 00:10 to 00:15
Curtailment_past	/	Curtailment between 00:00 to 00:05 = 0 (J_States[t=1, i=1])	Curtailment between 00:05 to 00:10 (J_States[t=1, i=2])
PV2B_past	/	PV2B between 00:00 to 00:05 = 0 (J_States[t=1, i=1])	PV2B between 00:05 to 00:10 (J_States[t=1, i=2])

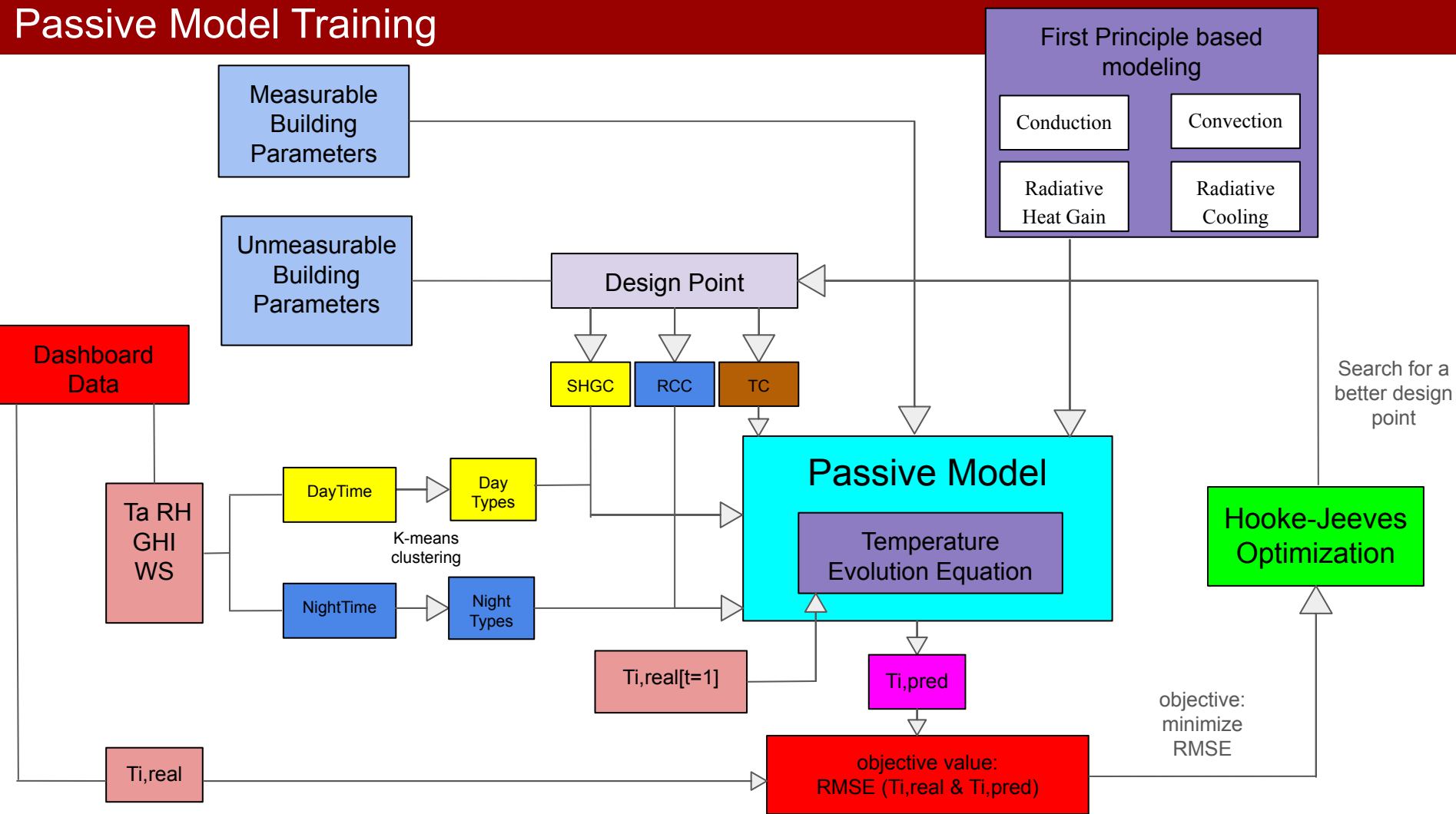
Initial States

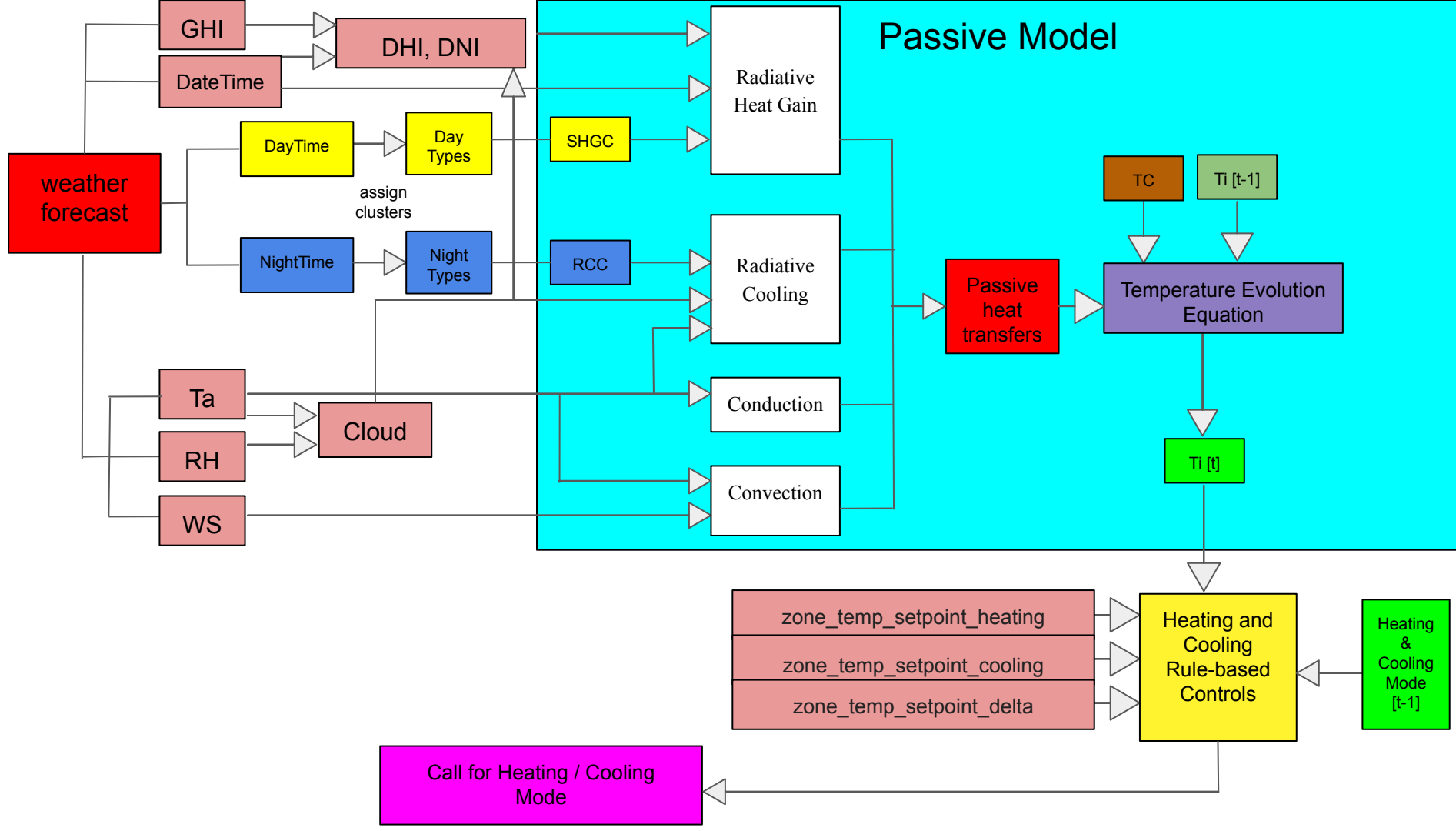
M State Name	Initial Value
PCM Hot Initial Temperature	48 [°C]
PCM Cold Initial Temperature	11 [°C]
Initial Indoor Temperature	22 [°C]
PCM Hot Capacity	11 [kWh]
PCM Cold Capacity	7 [kWh]
Zone Temperature Cooling Setpoint	22 [°C]
Zone Temperature Heating Setpoint	20 [°C]
Zone Temperature Delta Setpoint	0.5 [°C]
PCM Cold Initial SOC	0.5
PCM Hot Initial SOC	0.5
J State Name	Initial Value
PV Generation at last timestep	0 [kW]
Actual power consumption at last timestep	0 [kW]
Battery Initial SOC	0.5

Berg Structure Modeling



Passive Model Training





Heating & Cooling Rule-based Controls

	$T_i[t] < T_{\text{heat}} - T_{\text{delta}}$	$T_{\text{heat}} - T_{\text{delta}} \leq T_i[t] \leq T_{\text{heat}} + T_{\text{delta}}$	$T_i[t] > T_{\text{heat}} + T_{\text{delta}}$
Heating Mode $[t-1] = 0$	Heating Mode $[t] = 1$	Heating Mode $[t] = 0$	Heating Mode $[t] = 0$
Heating Mode $[t-1] = 1$	Heating Mode $[t] = 1$	Heating Mode $[t] = 1$	Heating Mode $[t] = 0$

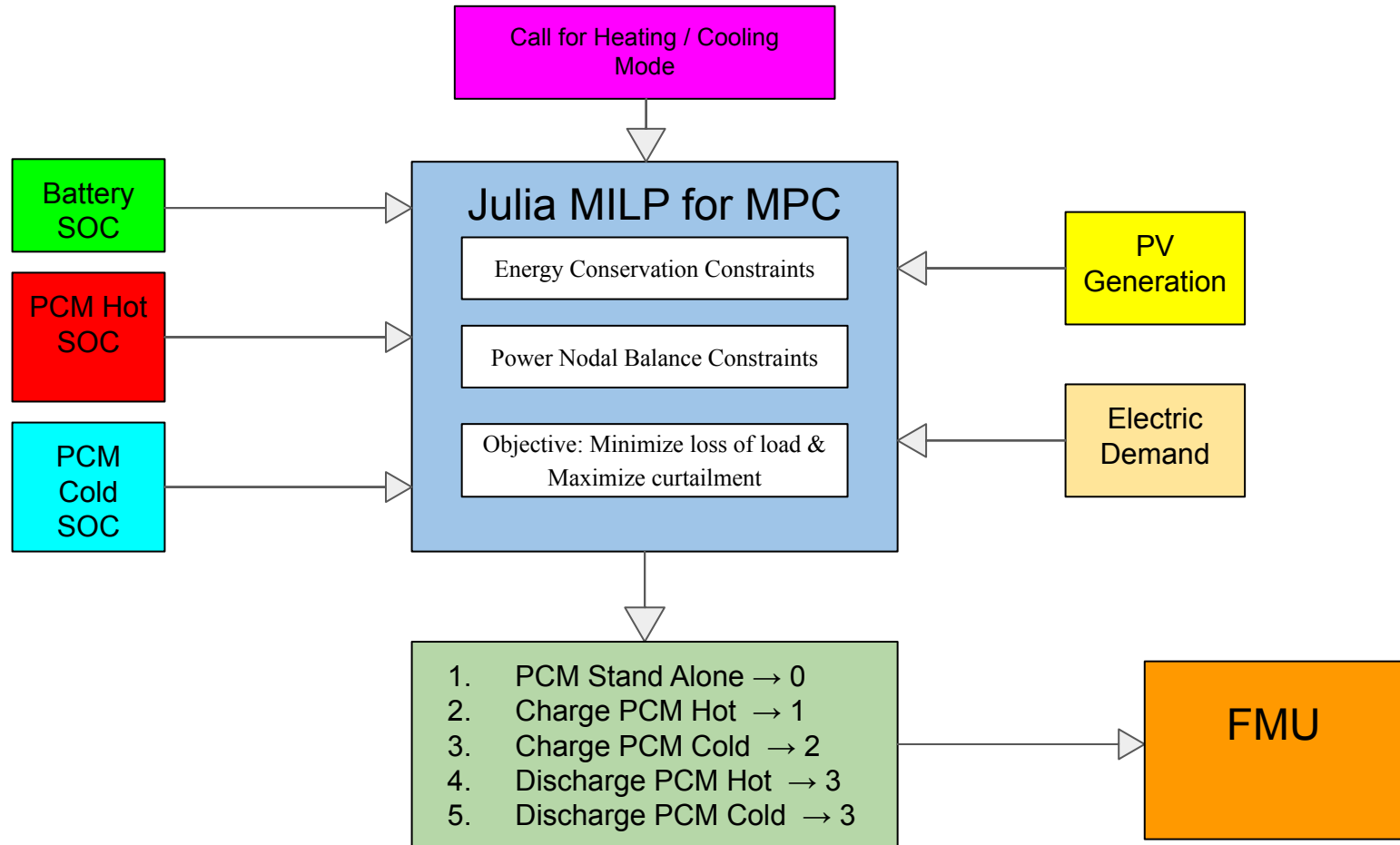
	$T_i[t] > T_{\text{cool}} + T_{\text{delta}}$	$T_{\text{cool}} - T_{\text{delta}} \leq T_i[t] \leq T_{\text{cool}} + T_{\text{delta}}$	$T_{\text{cool}} - T_{\text{delta}} < T_i[t]$
Cooling Mode $[t-1] = 0$	Cooling Mode $[t] = 1$	Cooling Mode $[t] = 0$	Cooling Mode $[t] = 0$
Cooling Mode $[t-1] = 1$	Cooling Mode $[t] = 1$	Cooling Mode $[t] = 1$	Cooling Mode $[t] = 0$

Heating Mode	HP Heating	PCM Hot Discharging
0	0	0
1	0	1
1	1	0
1	1	1

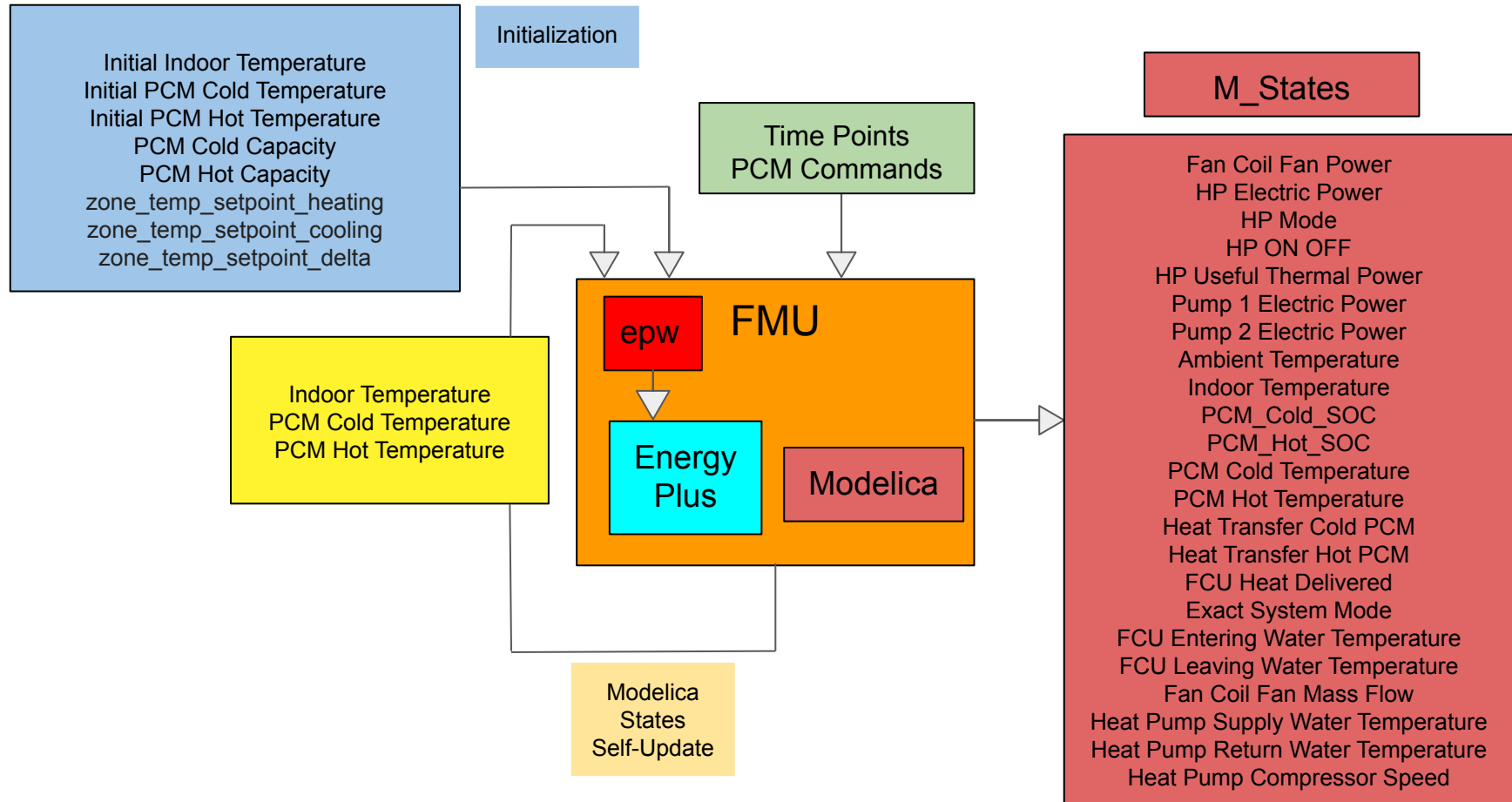
Cooling Mode	HP Cooling	PCM Cold Discharging
0	0	0
1	0	1
1	1	0
1	1	1

PCM Hot / Cold can be charged at anytime as long as its SOC < 1 and there is sufficient thermal power.

MILP Optimization



Modelica Output



Next Steps

- Update epw file (sub-hourly?)
- Improve forecast error modeling
- Finalize passive model and update Julia MPC
- Better modeling parameters such as COP, HP power rate, PCM charge & discharge rate etc.
- Consider more edge cases and make the system more robust