

A PROBABILISTIC APPROACH TO CONGESTION MANAGEMENT IN TRANSMISSION SYSTEMS OPERATION

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Motivation

Problem statement

Methodology

- Simulation Setup
- Probabilistic Congestion Forecasting
- From Probability to Action

Preliminary Insights

Limitations & Current Challenges

Outlook





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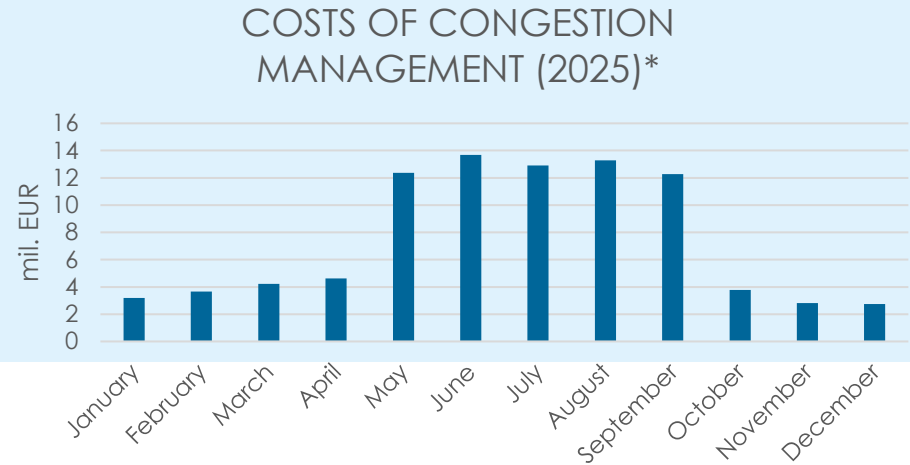
Preliminary Insights

Limitations & Current Challenges

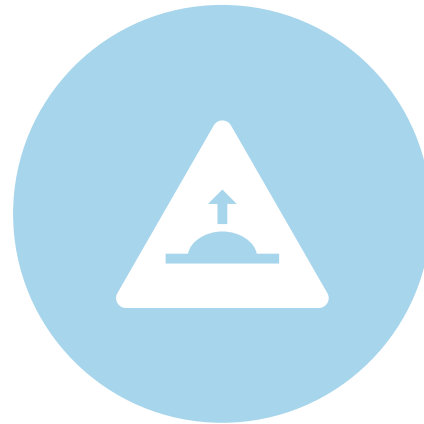
Outlook



Motivation



INCREASING RES / POWER GRID
COMPLEXITY → HIGHER
OPERATIONAL UNCERTAINTY



CONGESTION EVENTS : COSTLY,
OFTEN DETECTED *TOO LATE*



TSO OPERATION: LARGELY
DETERMINISTIC, LIMITED
ANTICIPATION OF RISK



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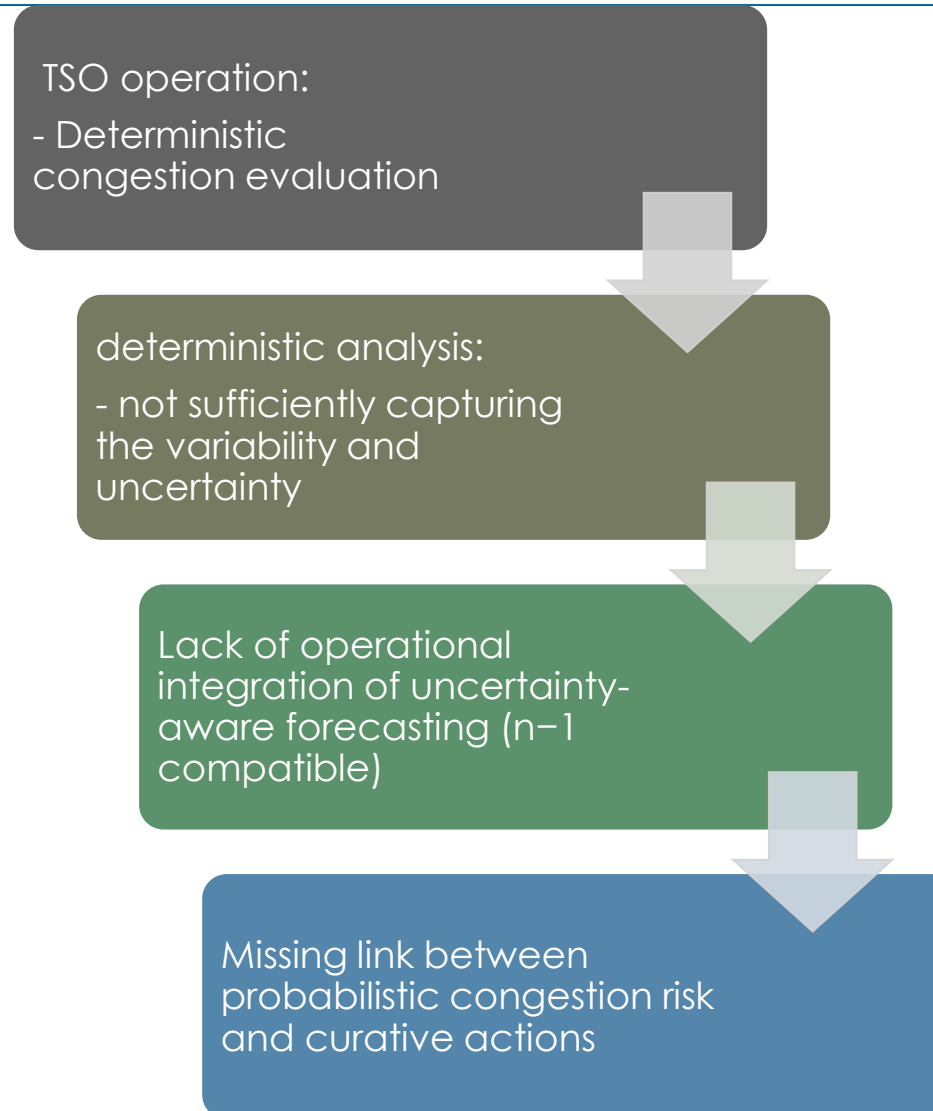
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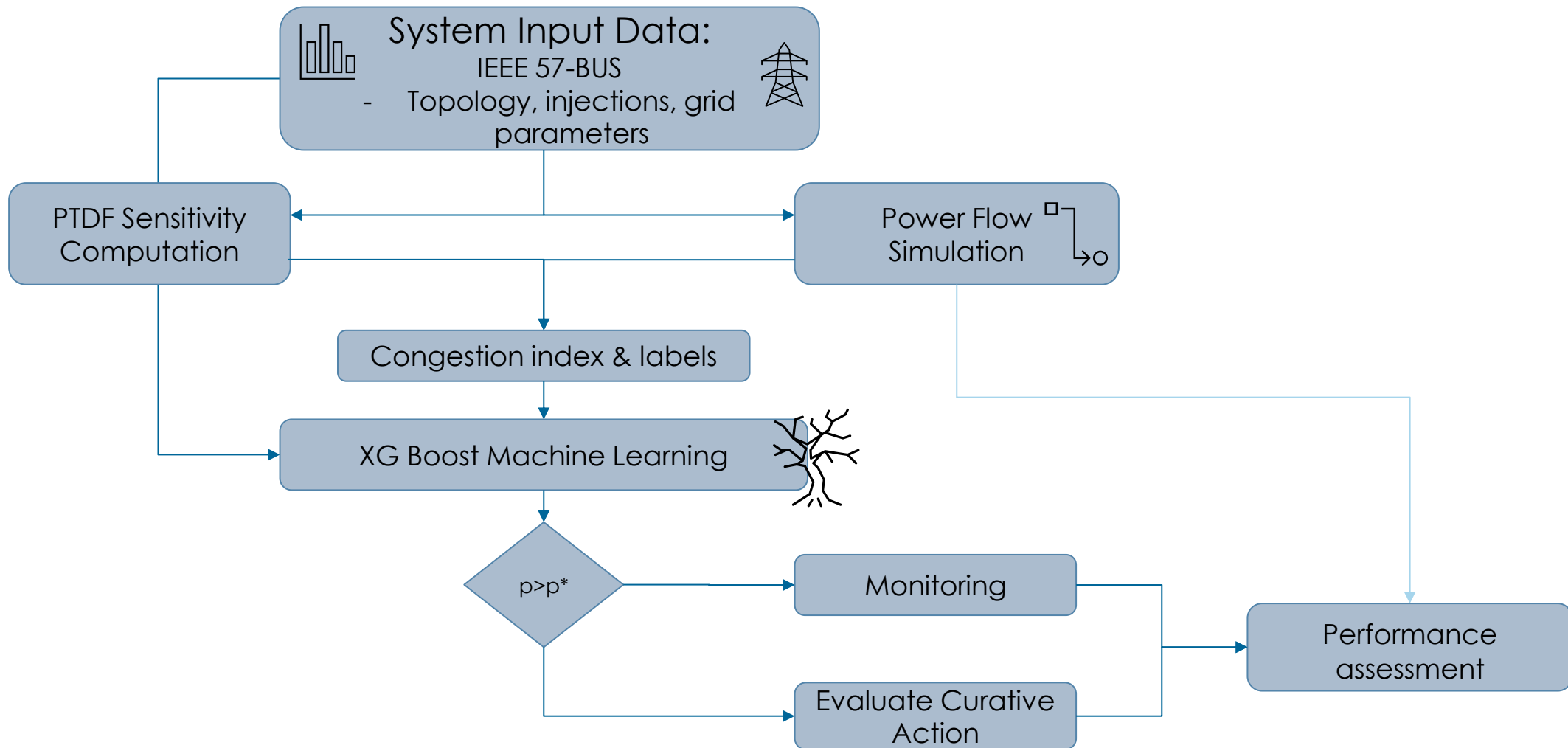
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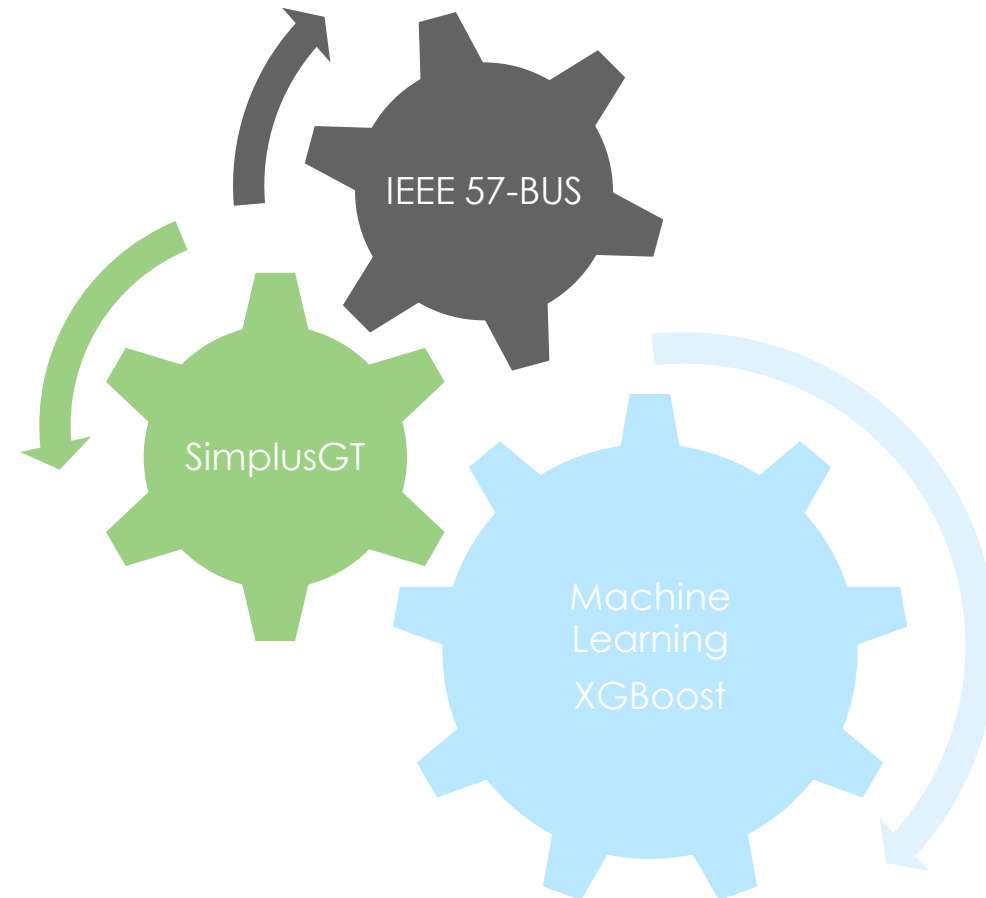
Limitations & Current Challenges

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- transmission system benchmark
- n-0 and selective n-1 contingency scenarios
- Stressed load and generation operating points
- Line thermal limits - congestion definition
- power flow and sensitivity analysis



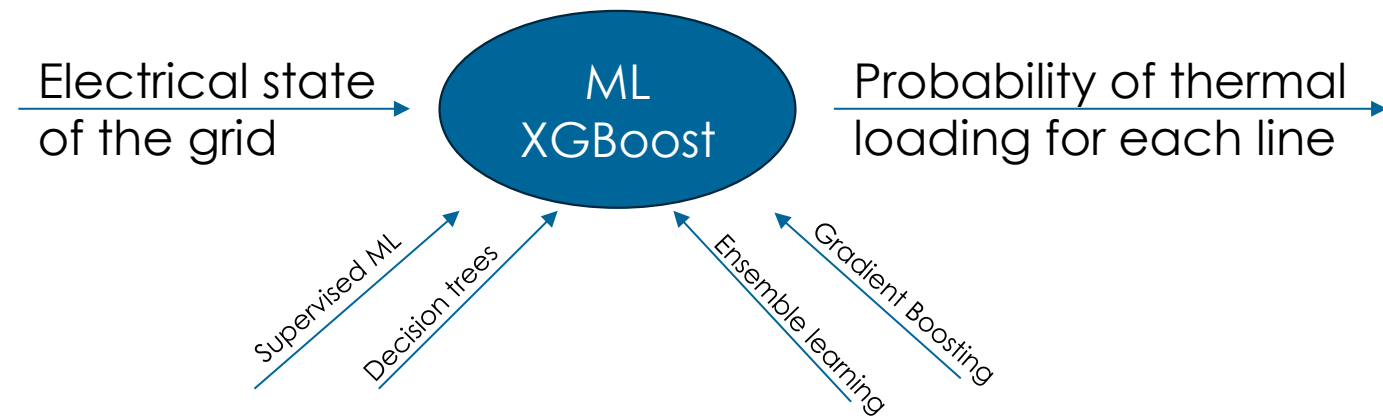
- Objective: early identification of congestion risk under uncertain operating conditions
- Line-level forecasting based on power-flow information

Input features:

- load and generation injections
- Network topology and contingency state
- PTDF-based indicators

XGBoost ML model

Output: probabilistic estimate of thermal limit exceedance per line



- Probabilistic congestion risk as early-warning signal
- Identification of high-risk operating conditions
- Line-level risk assessment under contingencies
- Power flow used for results evaluation



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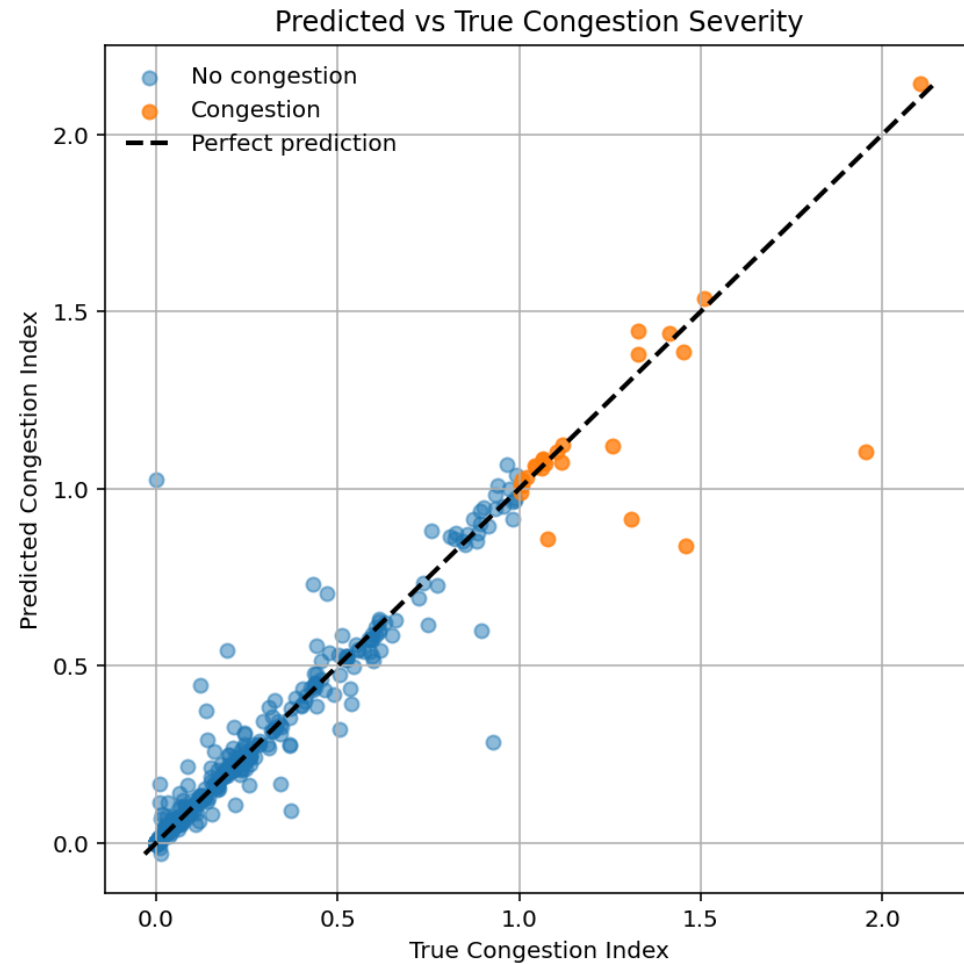
Preliminary Results

Limitations & Current Challenges

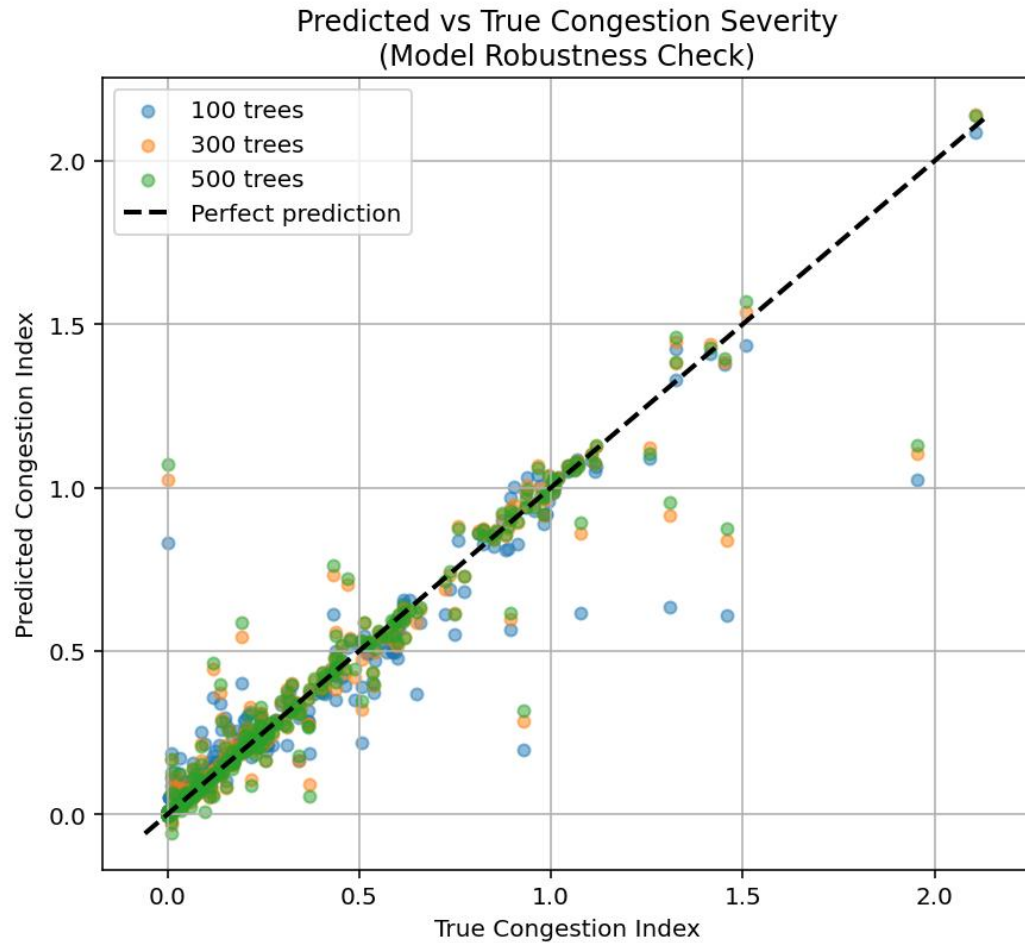
Outlook



<i>Category</i>	<i>Metric</i>	<i>Value</i>	<i>Interpretation</i>
Congestion detection	ROC-AUC	0.992	Effective separation
	Brier score	0.0156	Well-calibrated probabilities
Severity estimation	RMSE	0.093	Low severity error
	MAE	0.031	Small average deviation
	R ²	0.931	High explained variance
Uncertainty	σ	0.029	Stable prediction spread



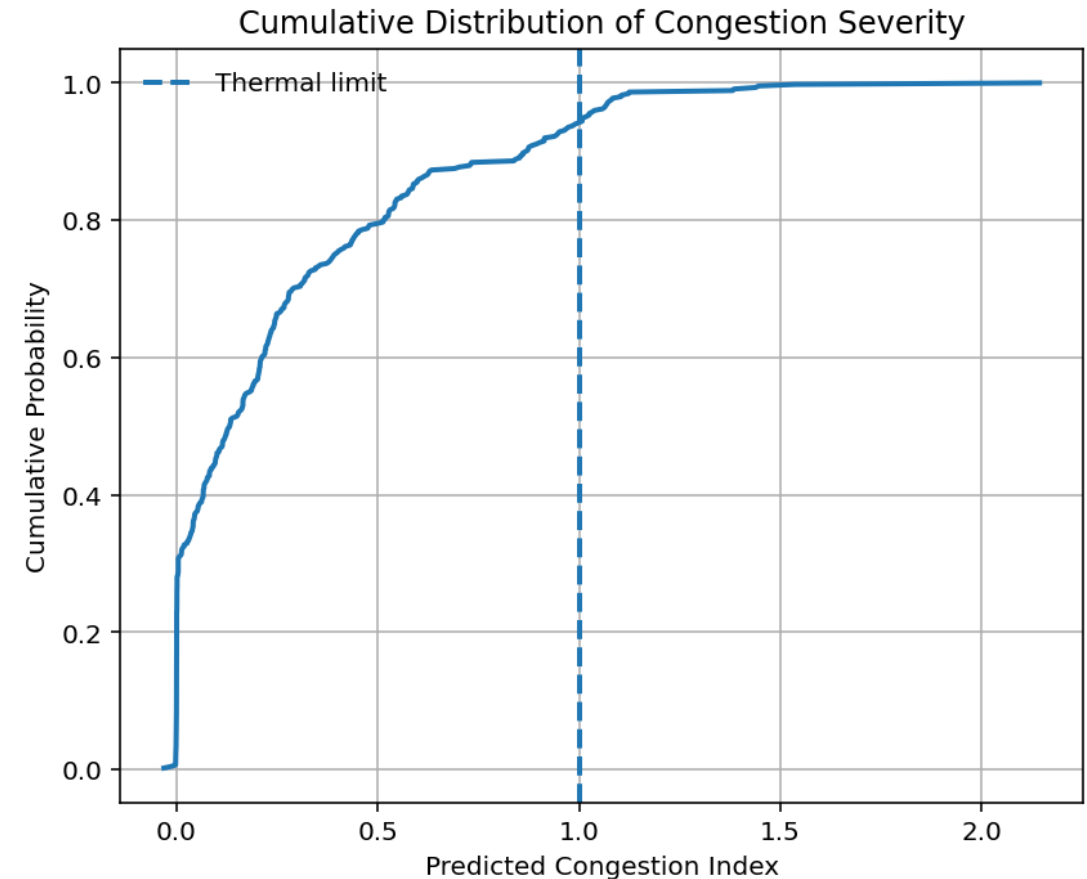
- Prediction of congestion severity across operating conditions
- Agreement between predicted and true congestion index



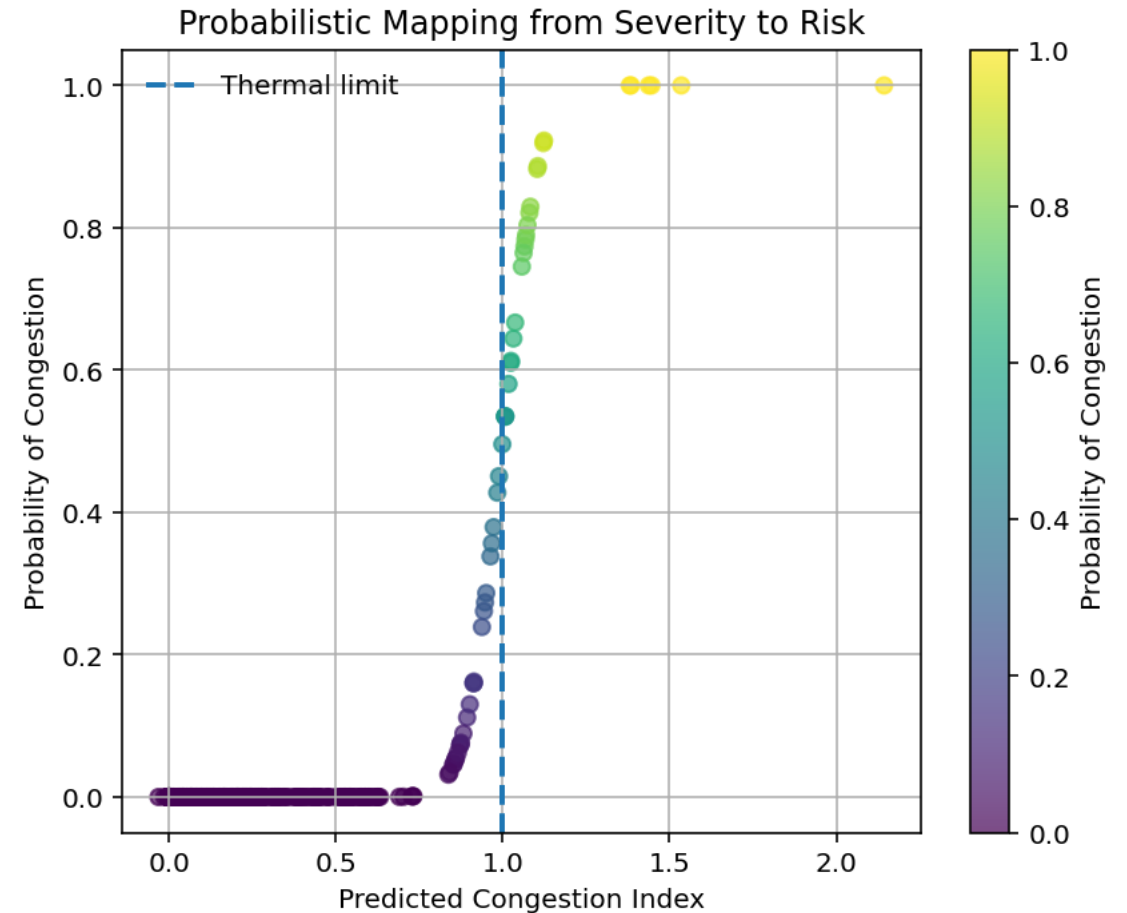
- Variation of number of estimators (decision trees) and tree depth (decisions per tree)

N estimators	max. depth	ROC-AUC	Brier Score	RMSE
100	6	0.9892	0.020	0.104
300	6	0.9924	0.016	0.093
500	6	0.9936	0.015	0.093
300	4	0.9905	0.020	0.101
300	6	0.9924	0.016	0.093
300	8	0.9915	0.018	0.099

- Congestion - high-impact operating condition
- Most predicted congestion indices below thermal limits
- Tail behavior motivates probabilistic rather than deterministic assessment



- Mapping from congestion severity to congestion probability
- Uncertainty explicitly represented near the thermal limit





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Limitations:

- *Static power flow formulation*
- *Simplifications – line limits*
- *No real operator data*

Challenges:

- *Computational scalability for large SimplusGT studies*
- *Model and uncertainty parameter tuning*
- *Simulation of time horizons with high temporal resolution*



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INCLUDE TEMPORAL
INFORMATION & TIME STAMP
INCLUDE RISK-BASED
CURATIVE ACTIONS
SENSITIVITY ANALYSIS OF
PROBABILITY THRESHOLD



EXTENSION TO:
- LARGER/REAL GRIDS
- ADDITIONAL CURATIVE
ACTIONS



APPLICATION:
REAL-TIME DECISION
SUPPORT IN TSO
CONTROL ROOMS

Thank you for your attention!

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