

Phase Identification of Smart Meters by Clustering Voltage Measurements

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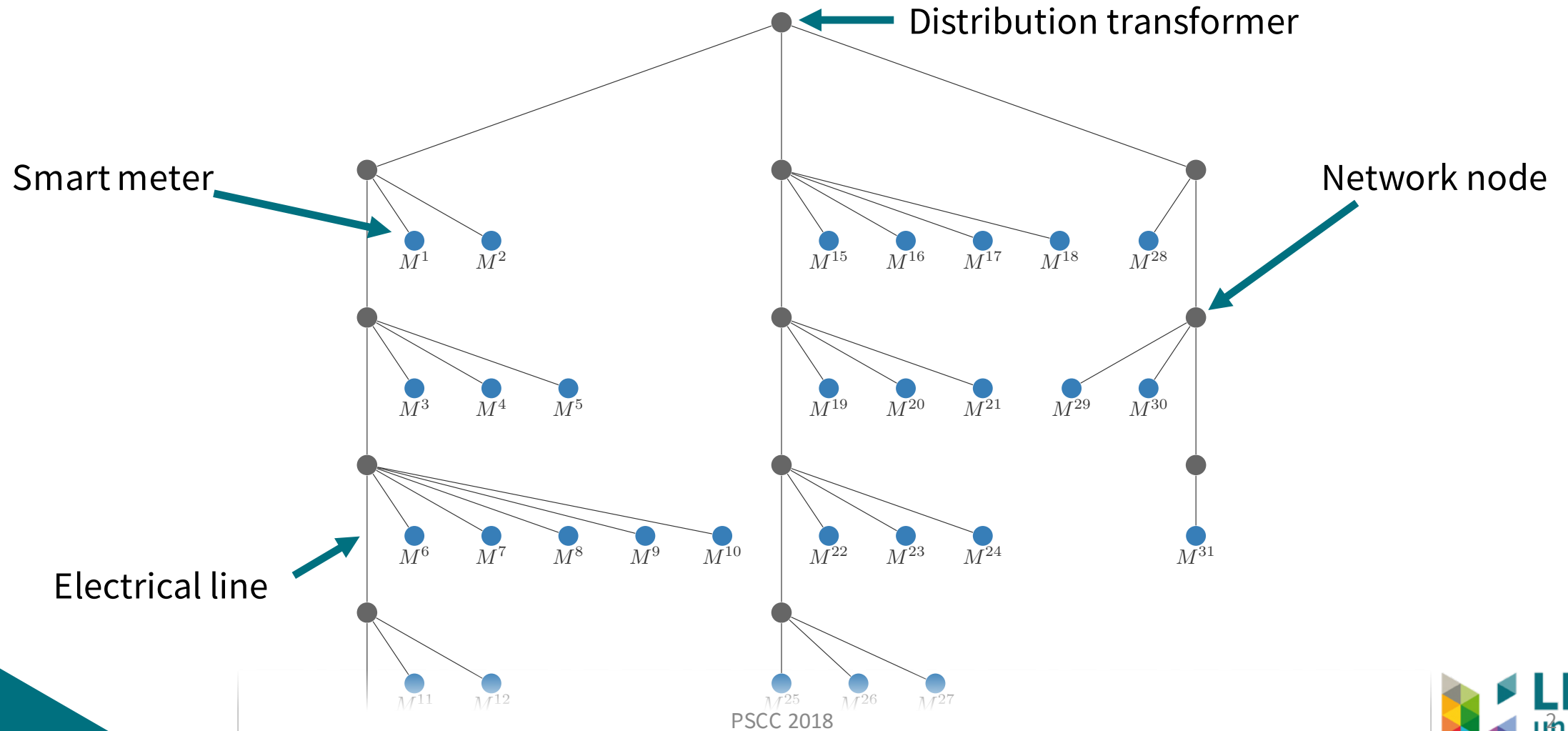
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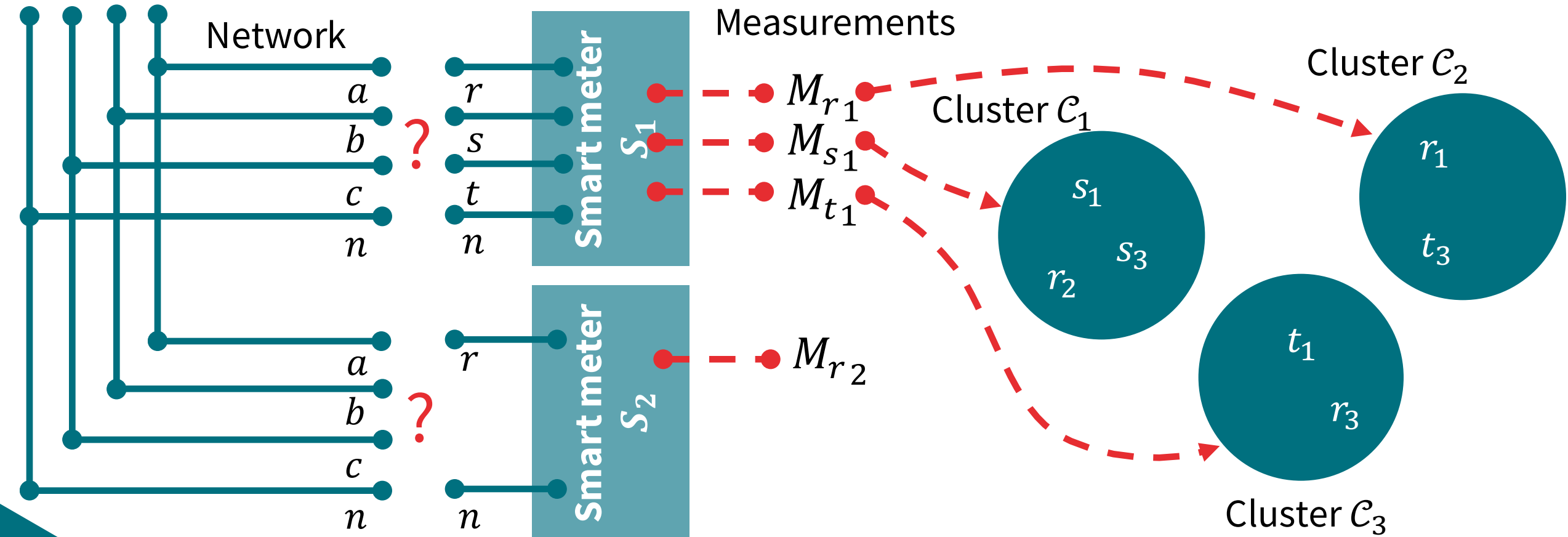
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Introduction



The phase identification problem



- Why is the phase information important?
- What are the existing solutions?
- What is the algorithm we propose?
- Performance and discussions

• Why is the phase information important? •

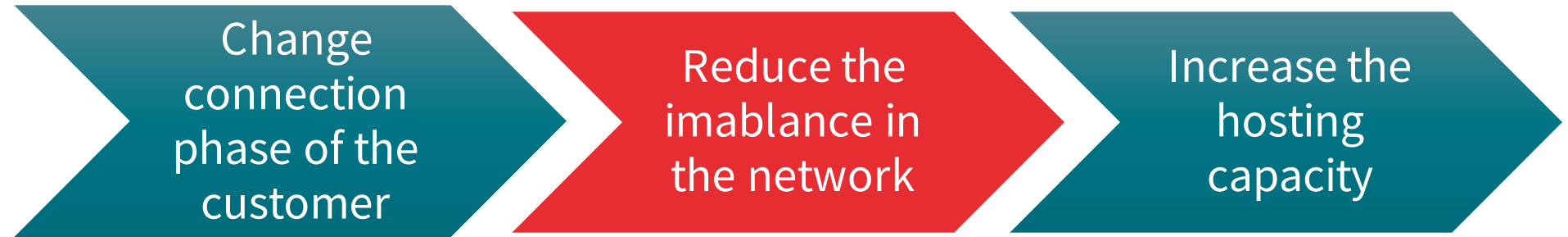
• What are the existing solutions? •

• What is the algorithm we propose? •

• Performance and discussions •

The phase identification is important

If you are
a DSO



If you are
a researcher



• Why is the phase information important?

• **What are the existing solutions?**

• What is the algorithm we propose?

• Performance and discussions

Existing solutions

Manual



Phase
identifiers

Automatic

Smart meters with PLC

k-means clustering

Graph theory

Contributions

1. Novel algorithm
 1. Using the underlying structure of the network
 2. Using the advantages of both graph theory and correlation
 3. Identifying the measurements that should be linked together and cluster them.
2. Performance compared to those of a constrained k-means clustering
3. Tested on real measurements from a distribution network in Belgium, in a variety of settings.

• Why is the phase information important?

• What are the existing solutions?

• **What is the algorithm we propose?**

• Performance and discussions

Distances

- Distance between two voltage measurements:
 - Pearson's correlation

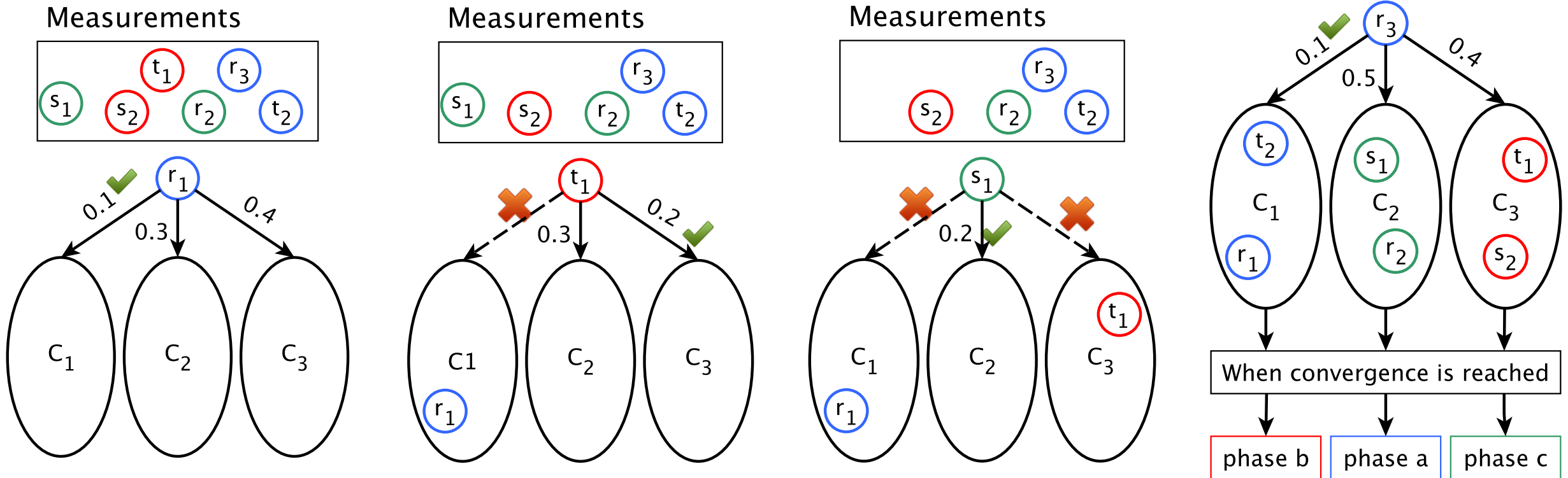
$$d(M_l, M_i) = 1 - PC(M_l, M_i), \quad \forall l, i \in \mathcal{J}$$

- Distance between a voltage measurement and a cluster

$$\Delta(\mathcal{C}_k, M_i) = \min_{l \in \mathcal{C}_k} d(M_l, M_i)$$

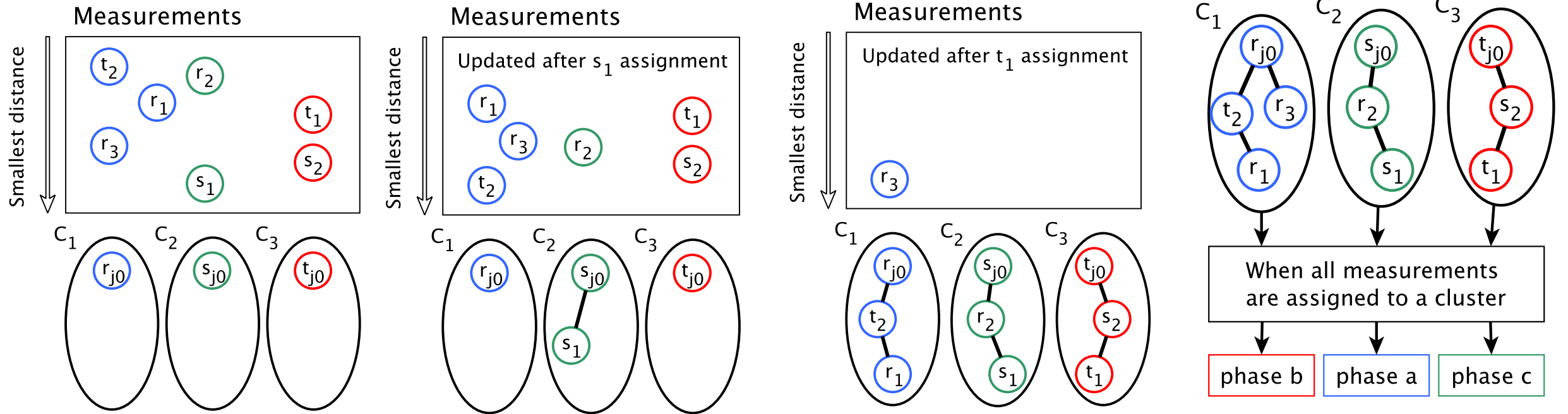
Reference algorithm

Constrained k-means Clustering



Proposed algorithm

Constrained Multi-tree Clustering



• Why is the phase information important?

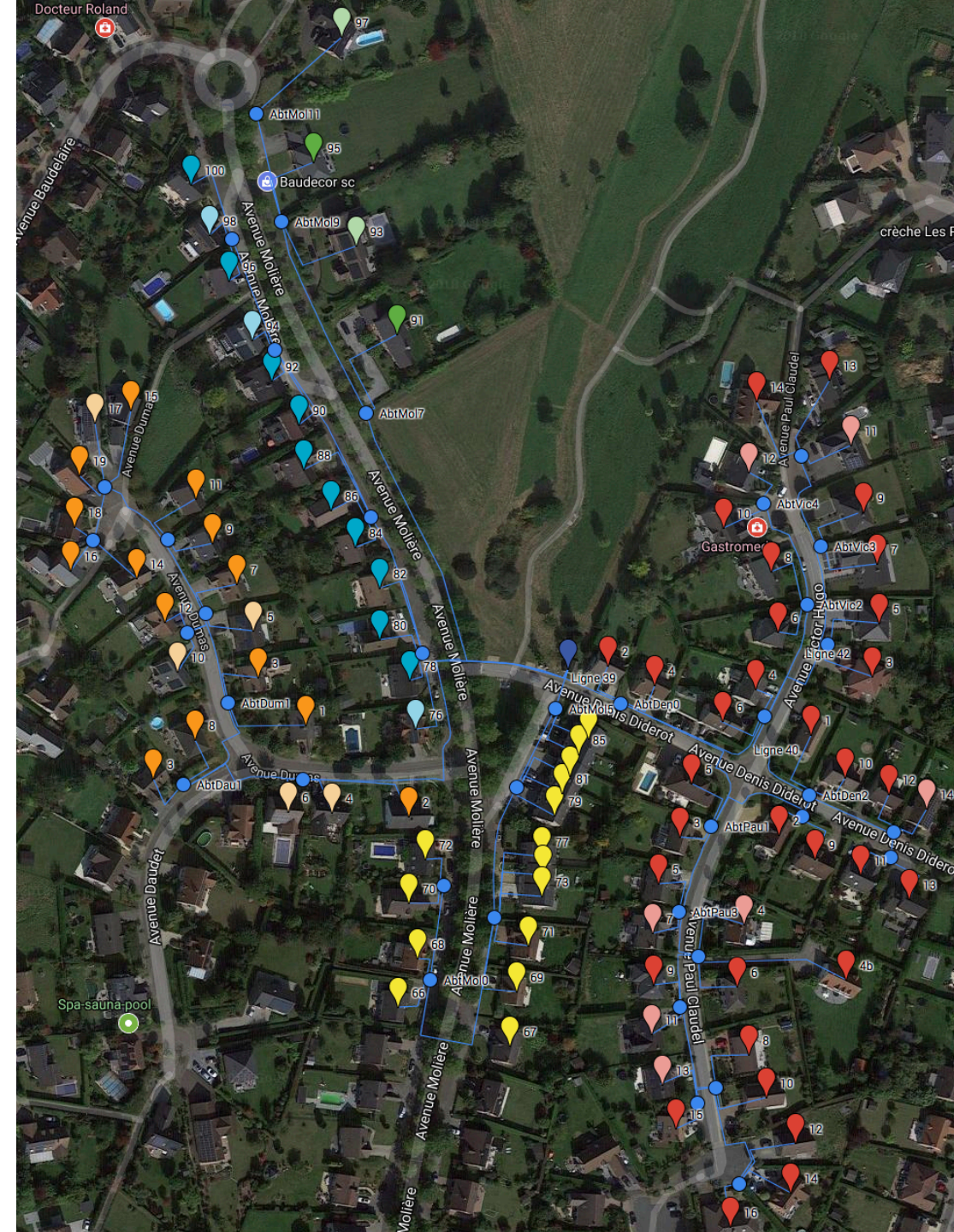
• What are the existing solutions?

• What is the algorithm we propose?

• **Performance and discussions**

Test system

- Belgium LV distribution network
- 5 feeders, star configuration 400 V
- 79 three-phase smart meters
- 2 single phase smart meters
- Average phase-to-neutral voltage measurements every minute

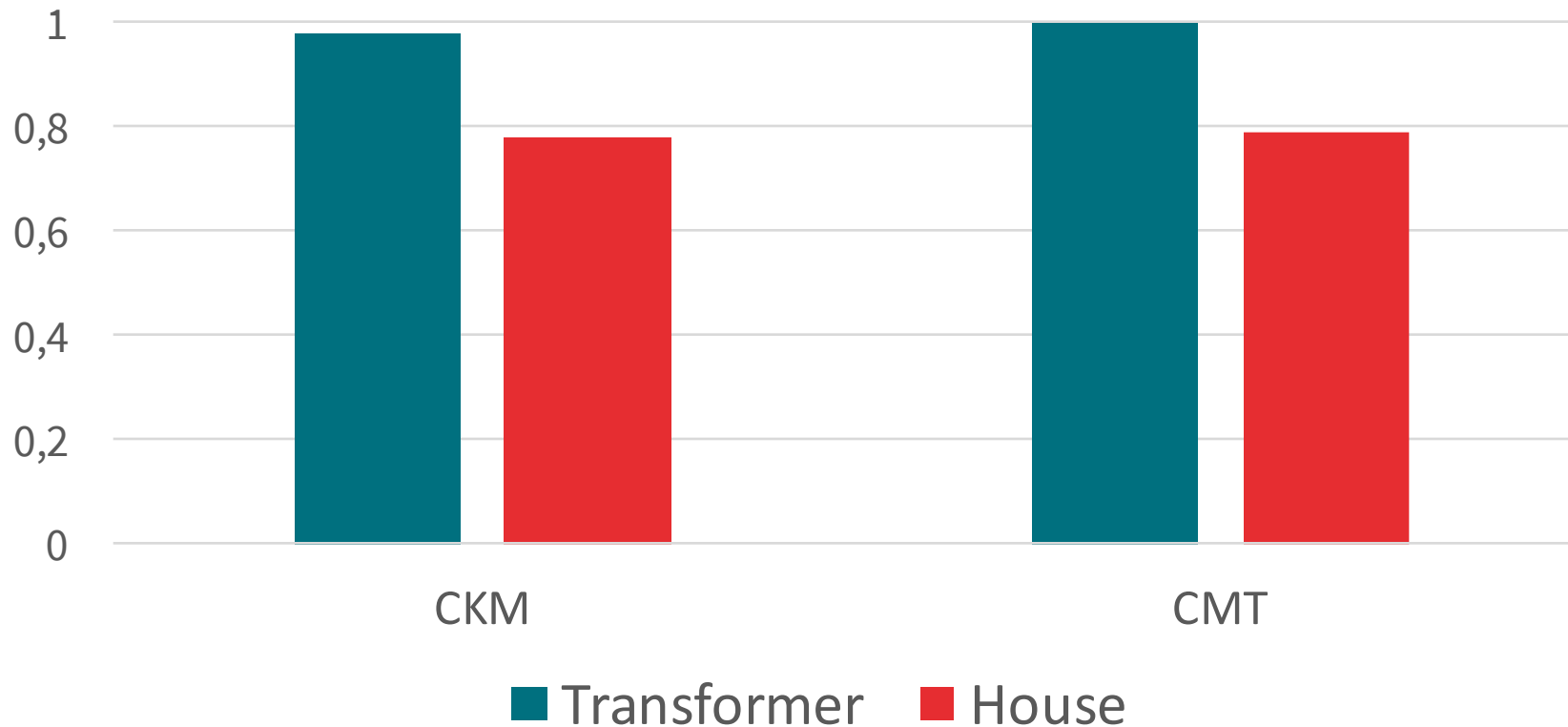


Results for the test sets

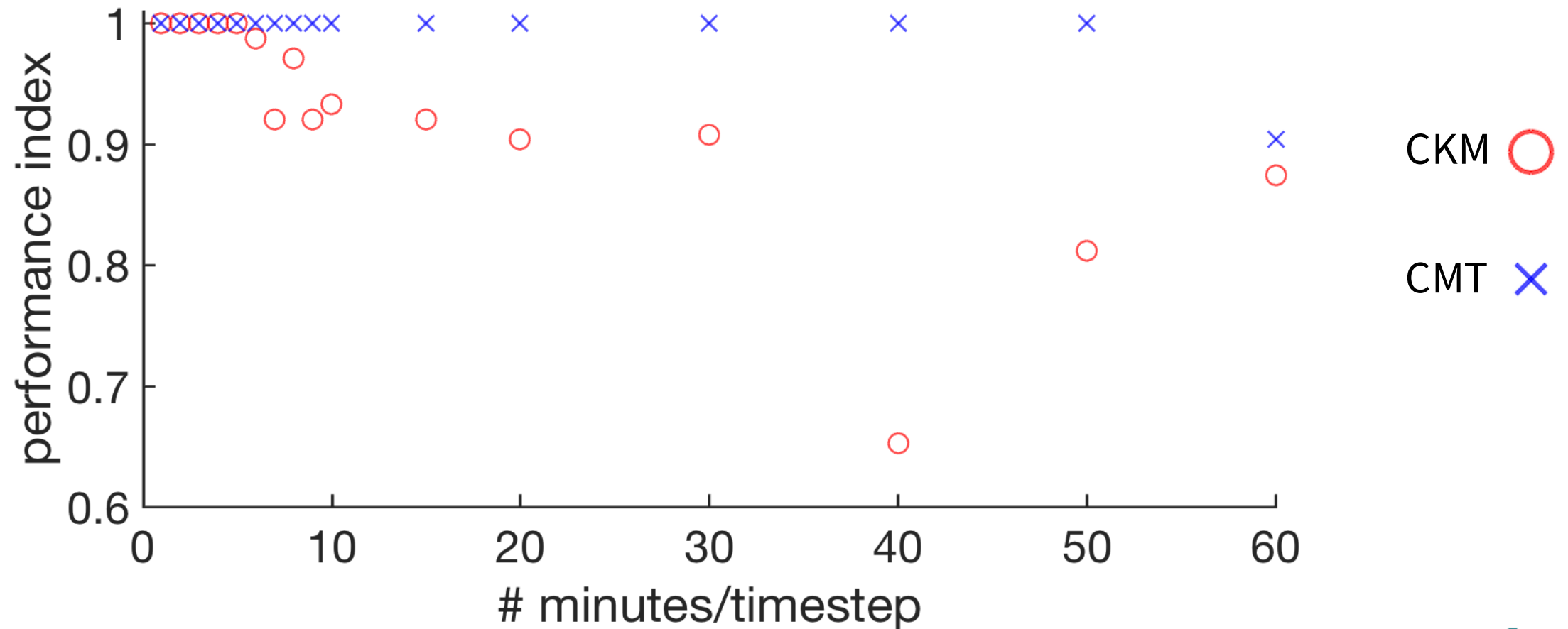
Discussions on the selection of the root

Performance measure

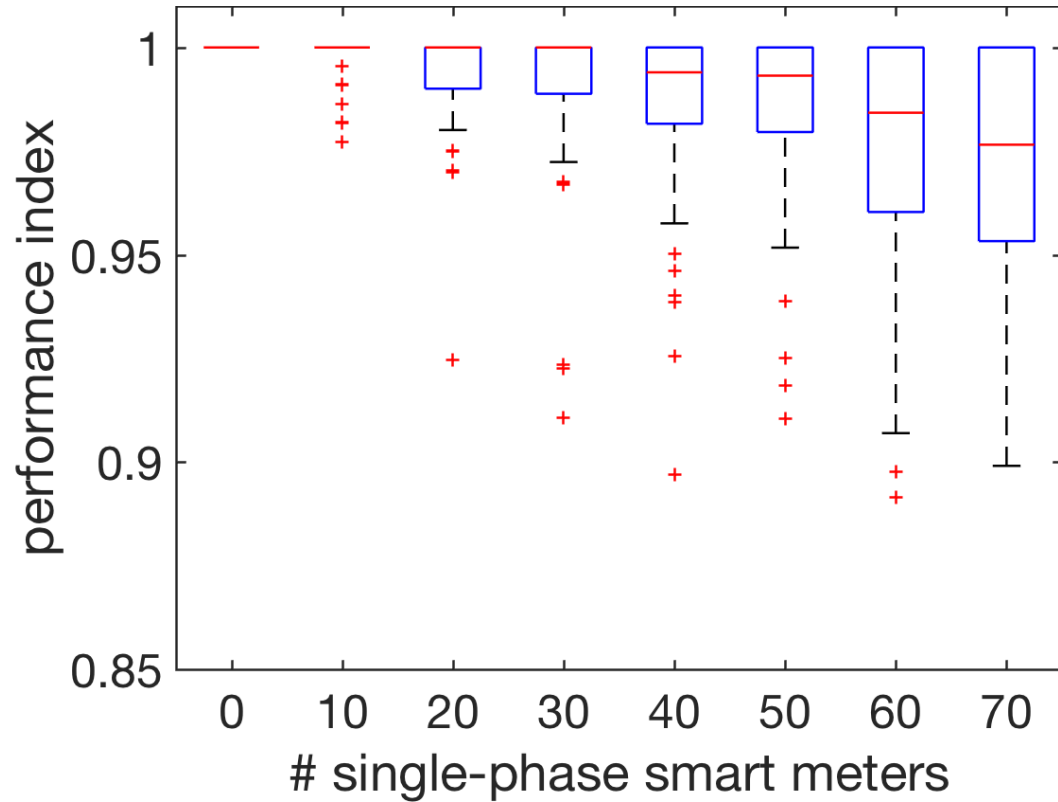
The ratio between the measurements correctly identified and the total number of measurements



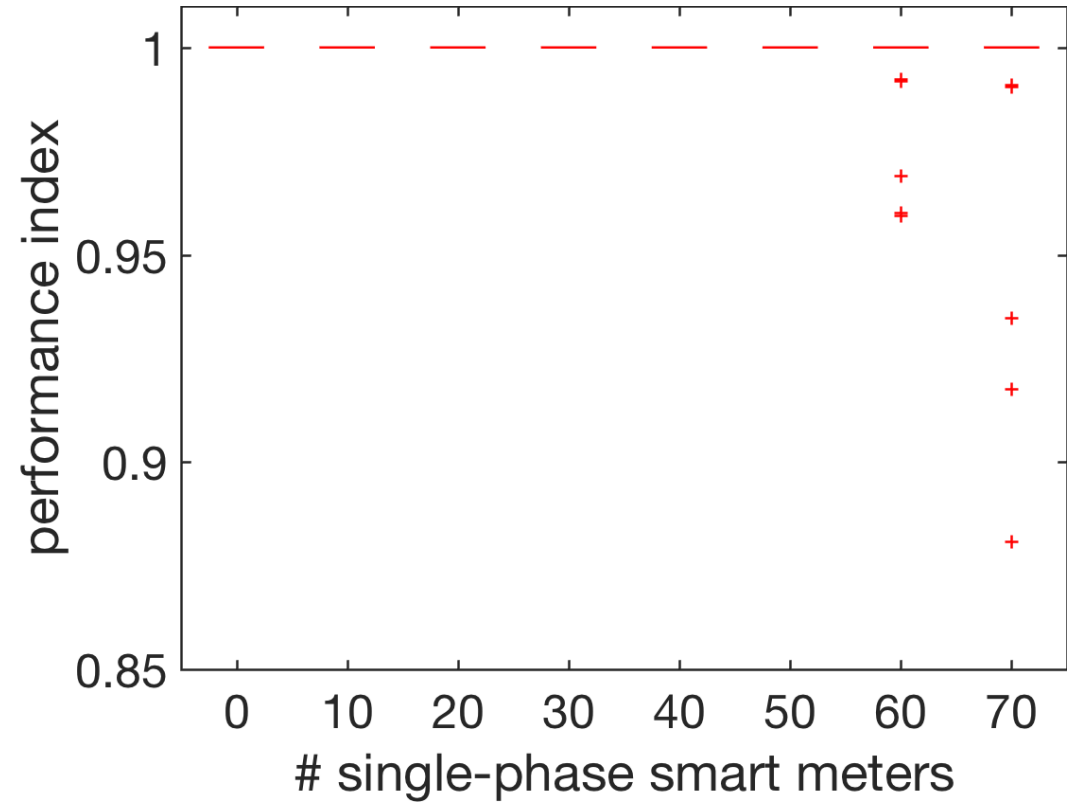
Influence of the voltage-averaging period



Influence of ratio single-phase – three-phase smart meters

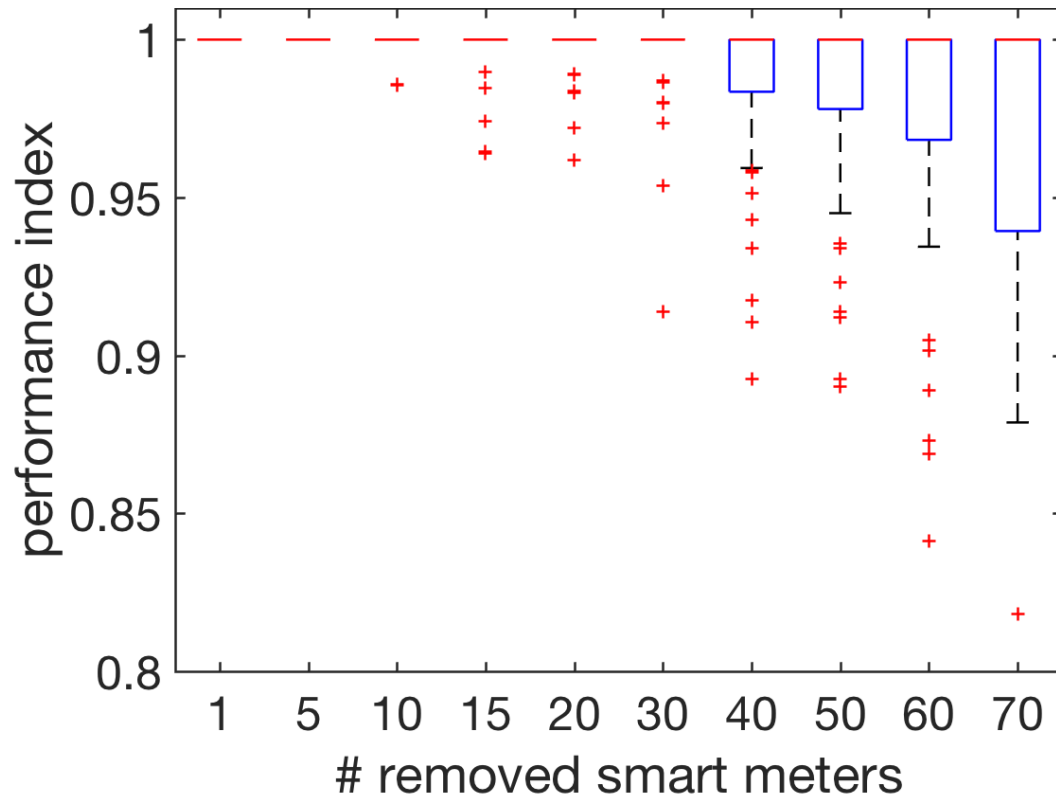


CKM

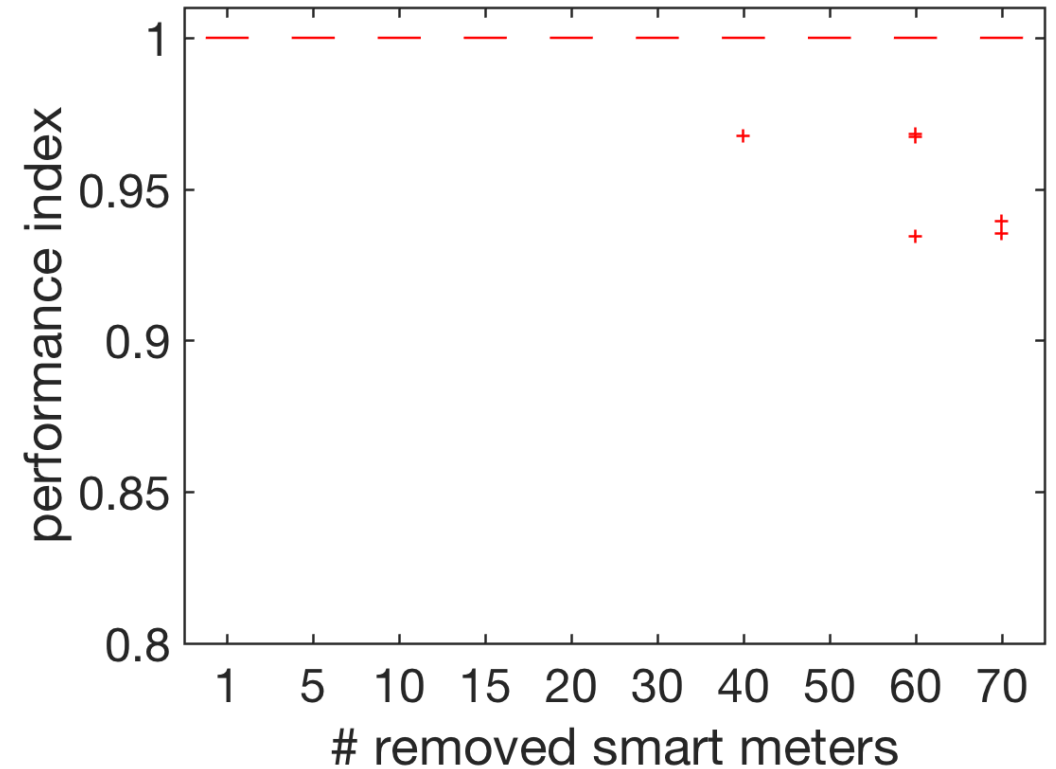


CMT

Influence of the number of smart meters



CKM



CMT

Conclusion

- Novel method to identify the phases of smart meters in LV distribution networks
- Clustering the voltage measurements using graph theory and the correlation between measurements
- A root smart meter as input upon which the clustering process is done
- Better performance than Constrained k -means clustering

Future works

- Use this novel method to infer network topology.
- Test the algorithm on measurements from other network configurations, such as
 1. 3-phase 4-wire with grounded neutral,
 2. 3-phase 3-wire (3x230V) and no ground.

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