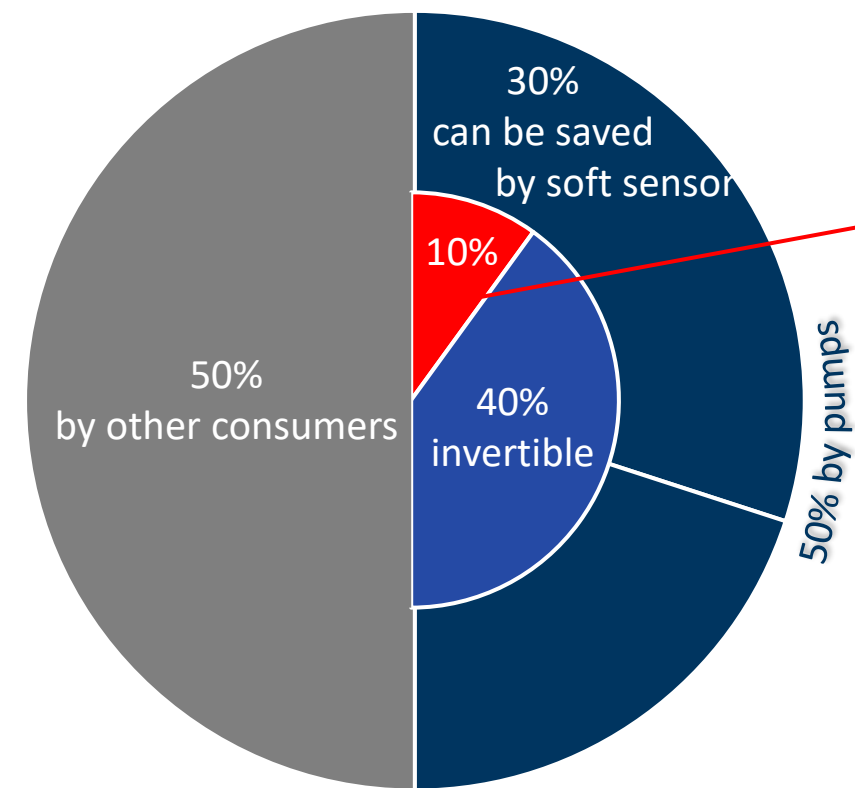


# ADVANCED FLOW RATE SOFT SENSOR FOR MARITIME PUMPS

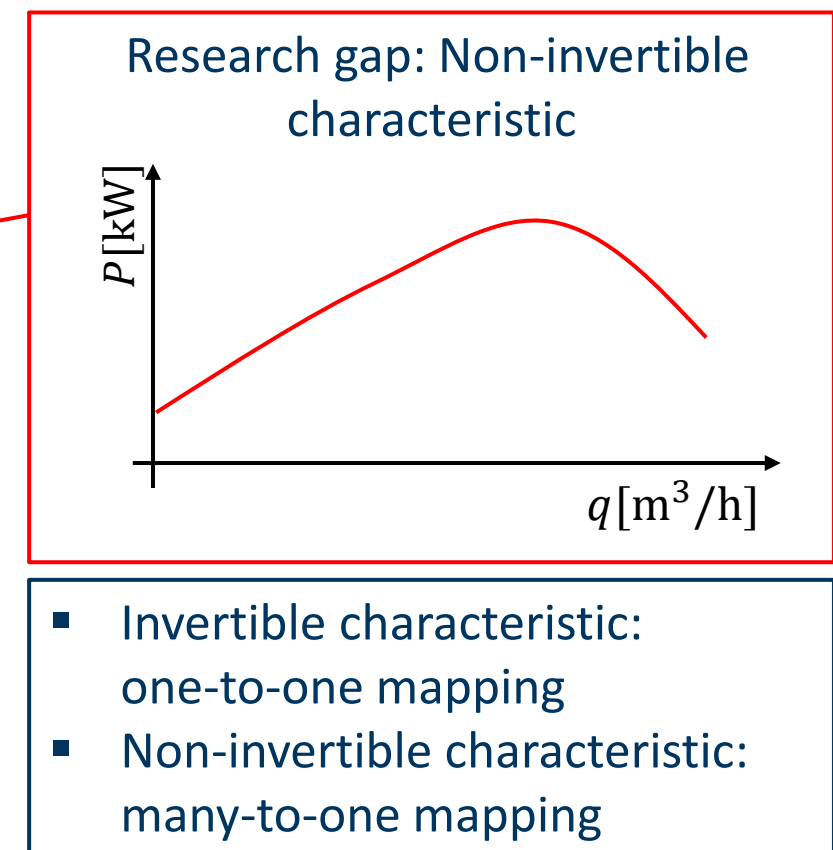
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## Motivation

- Pumps consume up to 50% of the electric energy used on ships.
- Flow rate soft sensors help to save up to 30% energy.
- Soft sensors can also reduce hardware costs, optimize performance, predict faults, and improve reliability.
- **Research gap:** Approximately 20% of maritime pumps exhibit **non-invertible characteristics**. State-of-the-art soft sensors cannot handle these.
- **Future goal:** Develop a flow rate soft sensor that also works for non-invertible characteristics.

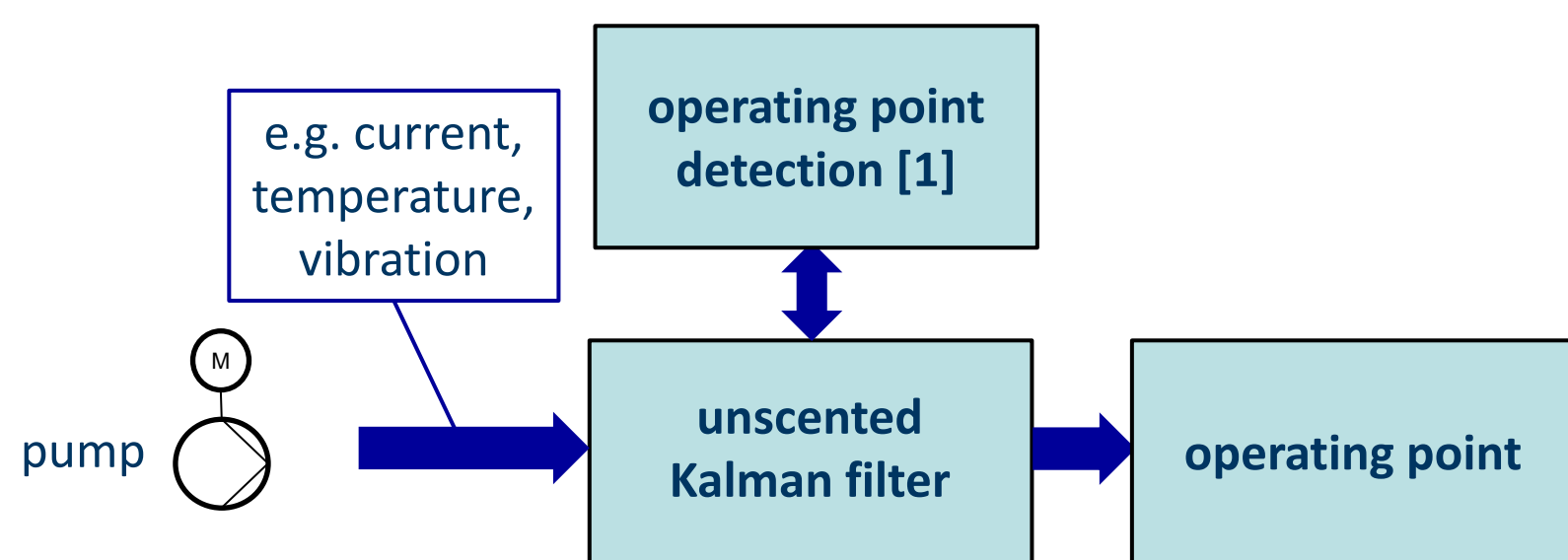


Energy consumption distribution on ships



## State of the Art

### Soft sensor



### Modeling based on the boundary curve model [2]

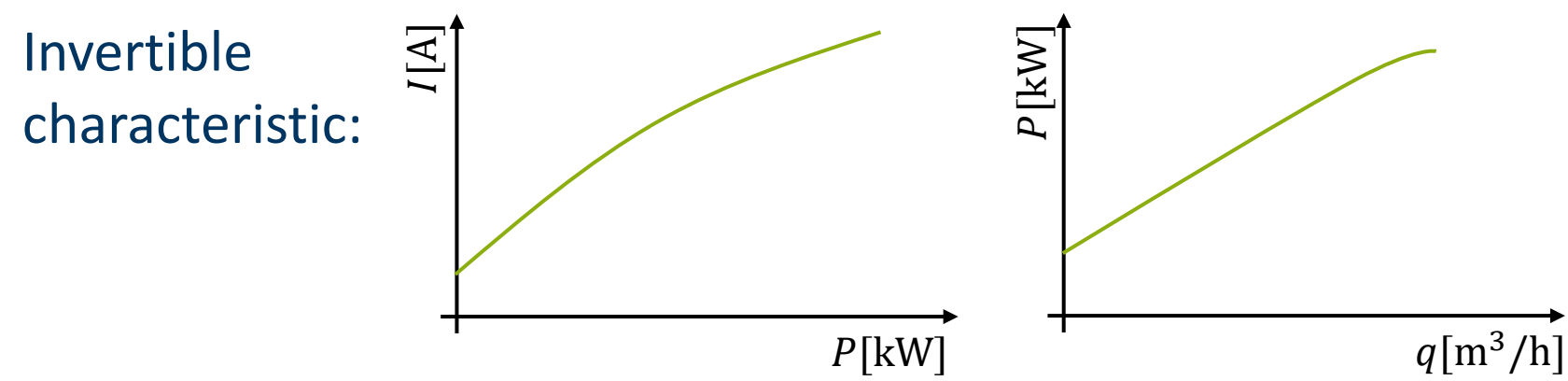
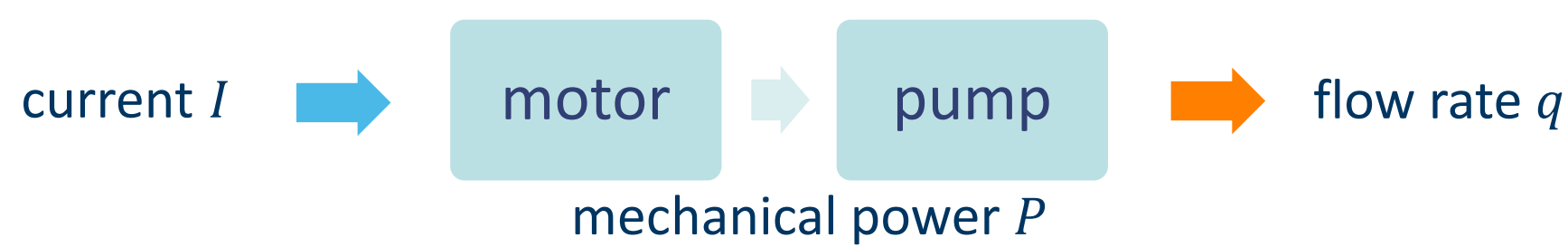


Fig. 1: Estimations based on the boundary curve model

$$I_{norm}(f) = \frac{I - I_{min}(f)}{I_{max}(f) - I_{min}(f)}$$

$$P_{norm}(f, I) = g_1(I_{norm}(f)) = \frac{P(f, I)}{P_{max}(f)}$$

Power estimation:  $\hat{P}(f, I) = P_{norm}(f, I) \cdot P_{max}(f)$

$$P_{norm}(f) = \frac{P - P_{min}(f)}{P_{max}(f) - P_{min}(f)}$$

$$q_{norm}(f, P) = g_2(P_{norm}(f)) = \frac{q(f, P)}{q_{max}(f)}$$

Flow rate estimation:  $\hat{q}(f, P) = q_{norm}(f, P) \cdot q_{max}(f)$

## Results

- Test in real-time in the lab.
- Accurate and reliable estimations of flow rate and current in real-time applications.

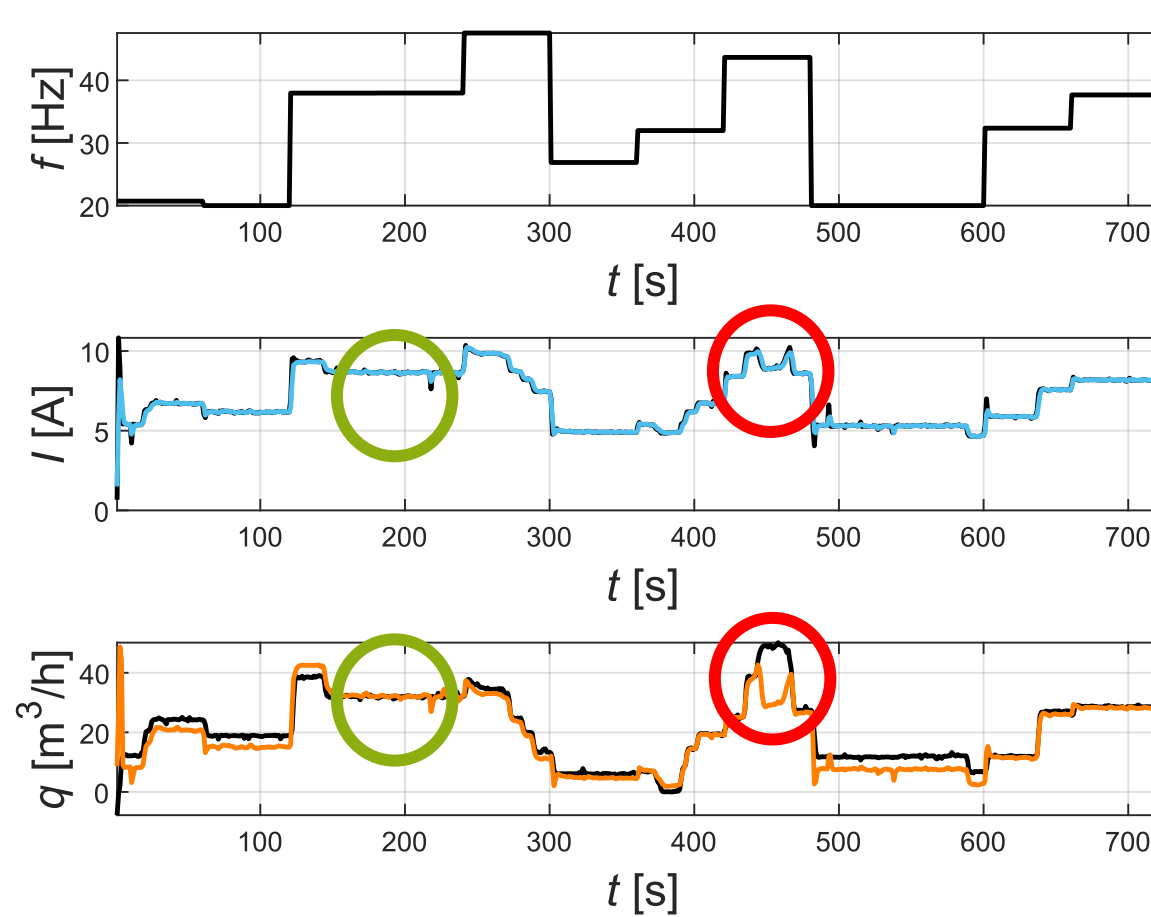


Fig. 2: Soft sensor performance evaluation

Estimations (orange, blue) follow the actual values (black) well.

The larger estimation error is caused by non-invertible characteristics.

These characteristics will not influence the estimation of  $I$ .

We need advanced algorithms to extend to non-invertible characteristics.

## Challenge and Approach

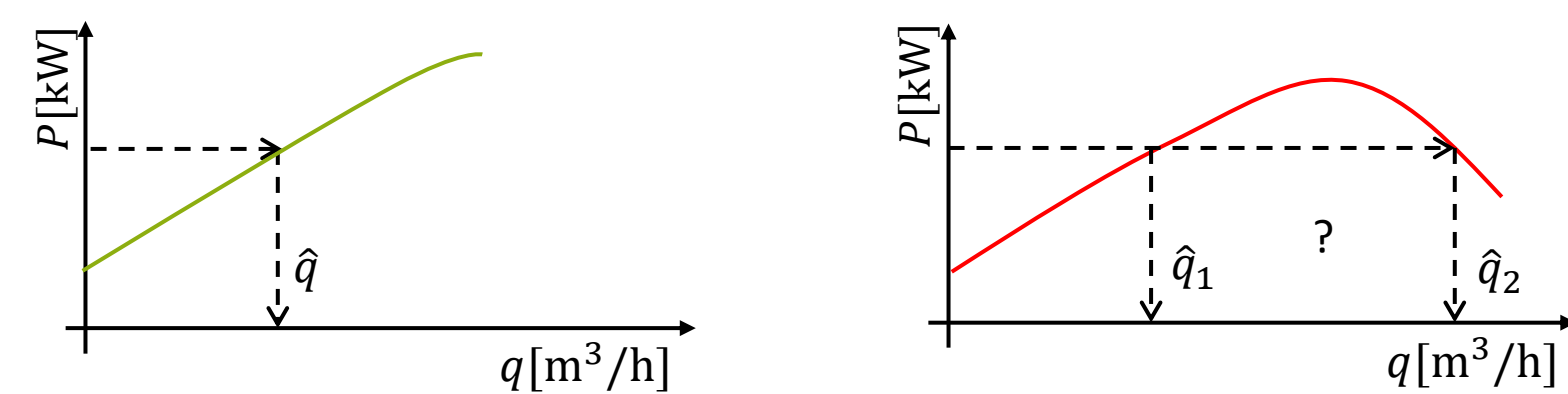
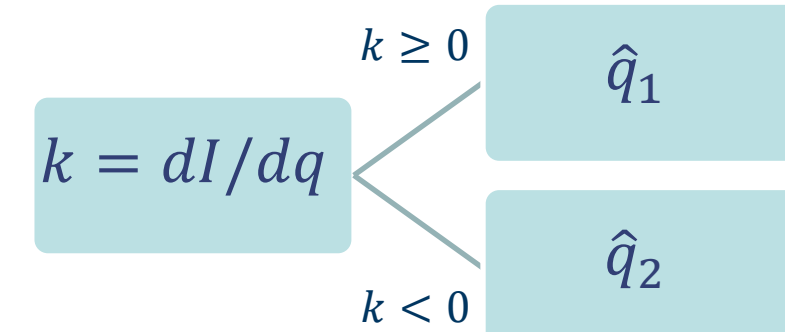


Fig. 3: Invertible and non-invertible characteristics

- Non-invertible characteristic leads to more than one estimation.
- Wrong selection may cause poor energy efficiency and damage.
- How to determine the proper estimation?

- If slope magnitude  $k \geq 0$ , the flow rate estimation  $\hat{q} = \hat{q}_1$ .
- If  $k < 0$ ,  $\hat{q} = \hat{q}_2$ .



## Acknowledgment

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## References

- [1] S. Leonow and M. Mönnigmann, "Operating point estimation in hydraulic turbomachines with non-invertible characteristics", European Control Conference (ECC), 2016.
- [2] S. Leonow and M. Mönnigmann, "Soft sensor based dynamic flow rate estimation in low speed radial pumps", European Control Conference (ECC), 2013.

## Conclusion and Outlook

- The soft sensor provides sufficient precision in real-time.
- Simplify the nonlinear model to reduce the number of required measurements.
- Extend the soft sensor to pumps with non-invertible characteristics.

24<sup>th</sup> International Conference on Process Control, Štrbské Pleso, Slovak Republic, 2023.