# Uncertainty Quantification for Electronic-System Design

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# Uncertainty?

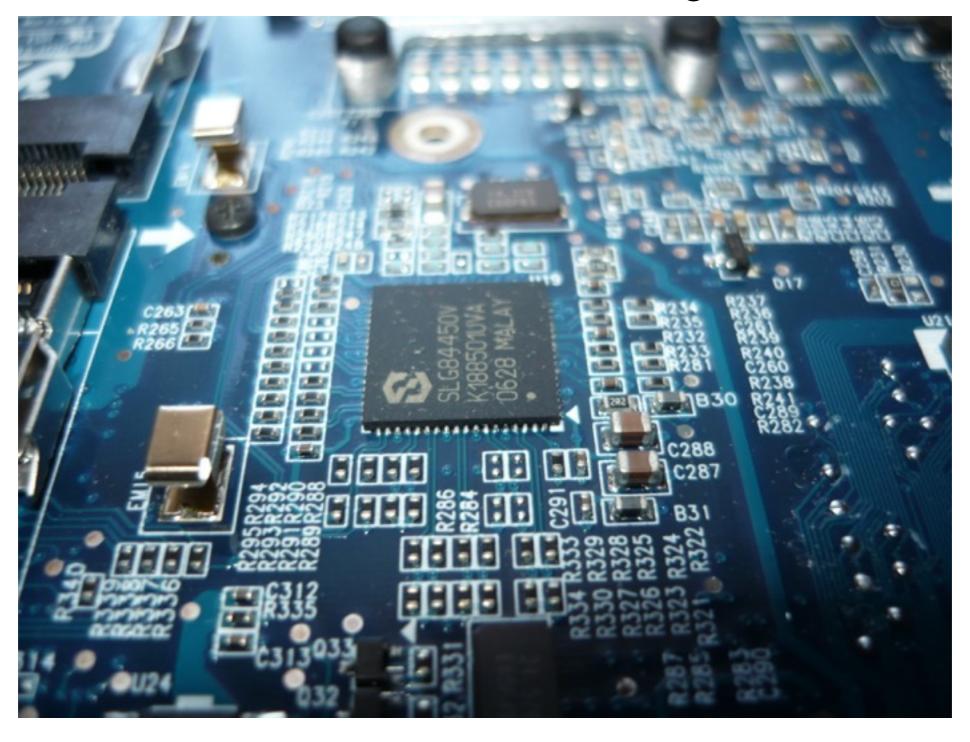


Photo: AAAndrey A, https://goo.gl/eFhcto

# Uncertainty?

- Process variation
- Environment
- Workload
- Aging

### Fabrication

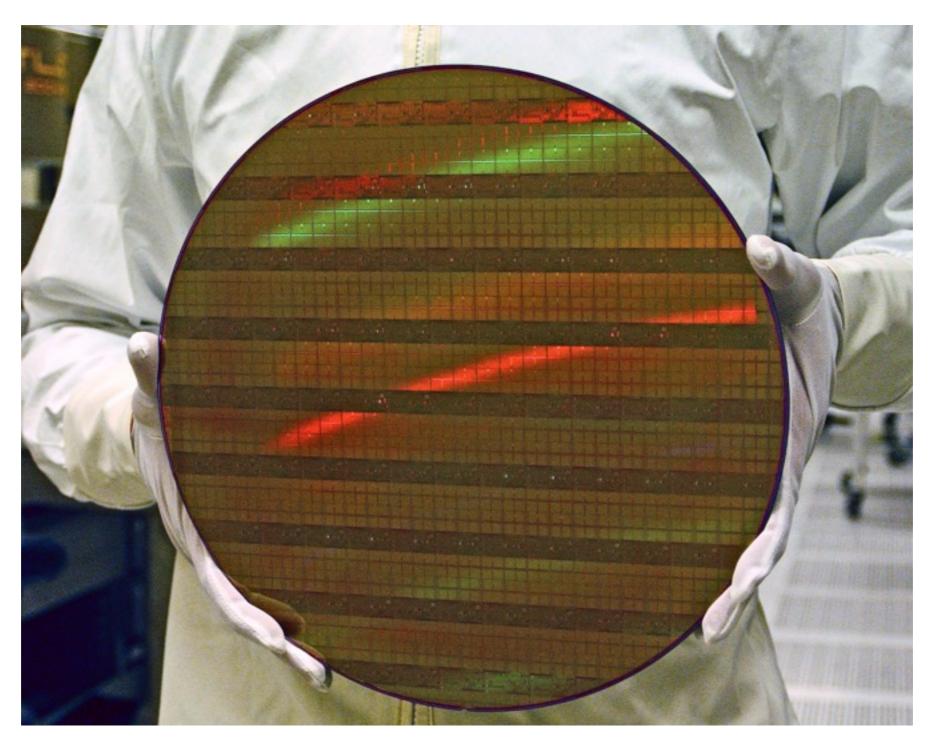
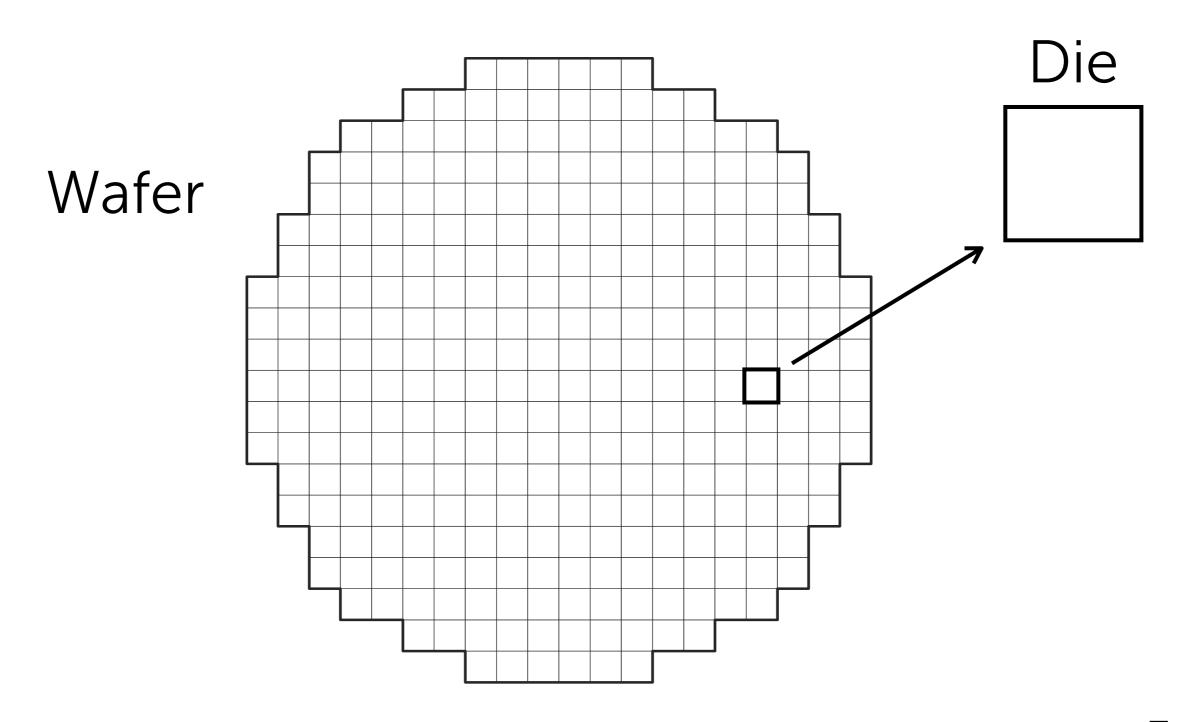
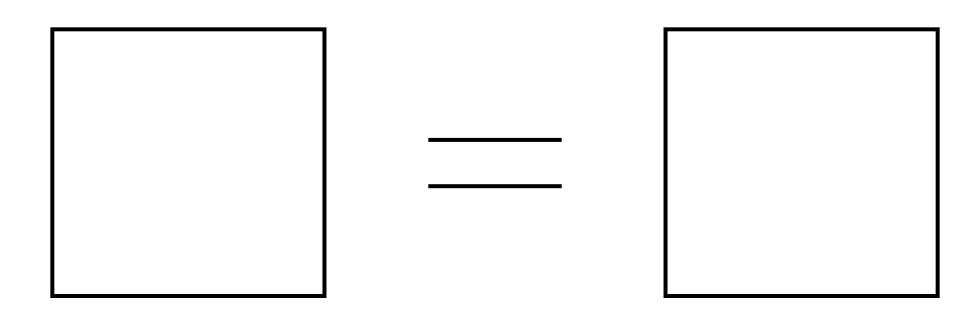
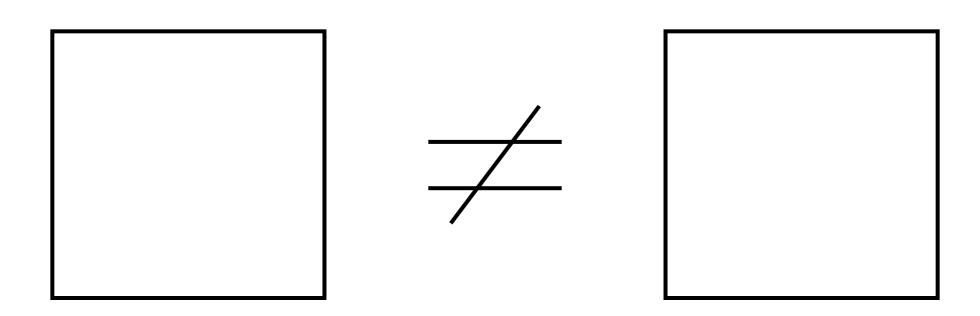


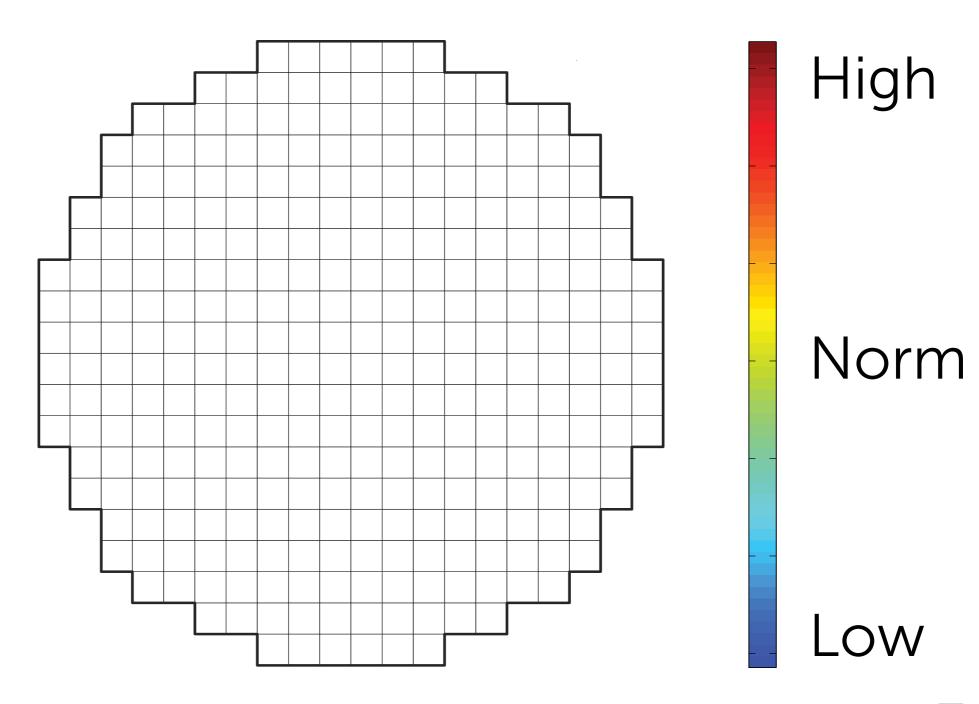
Photo: Intel, https://goo.gl/mHMxe1

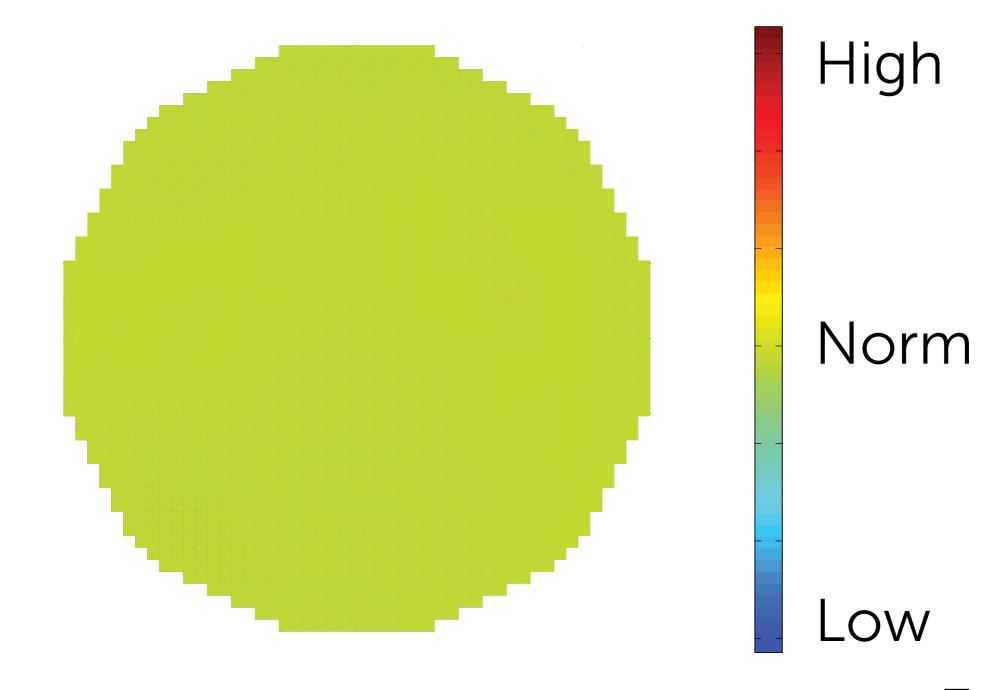
#### Fabrication

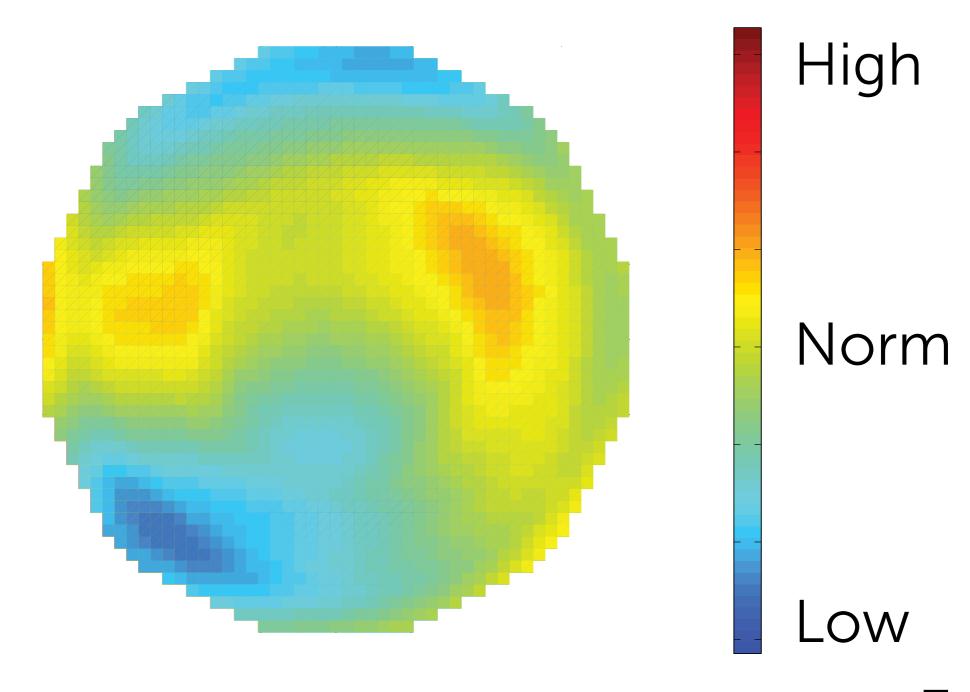


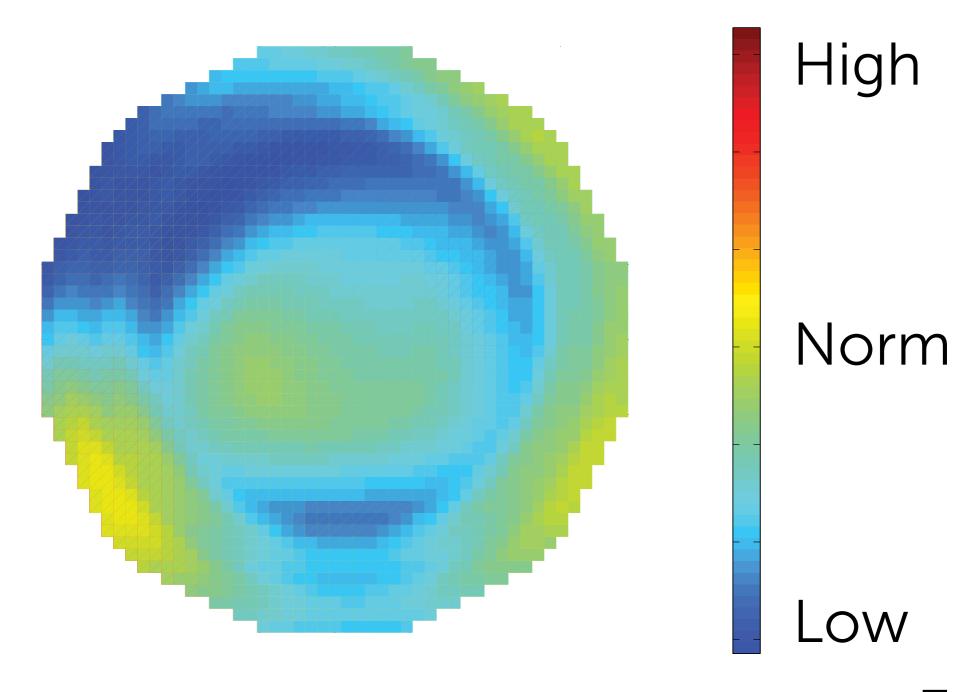


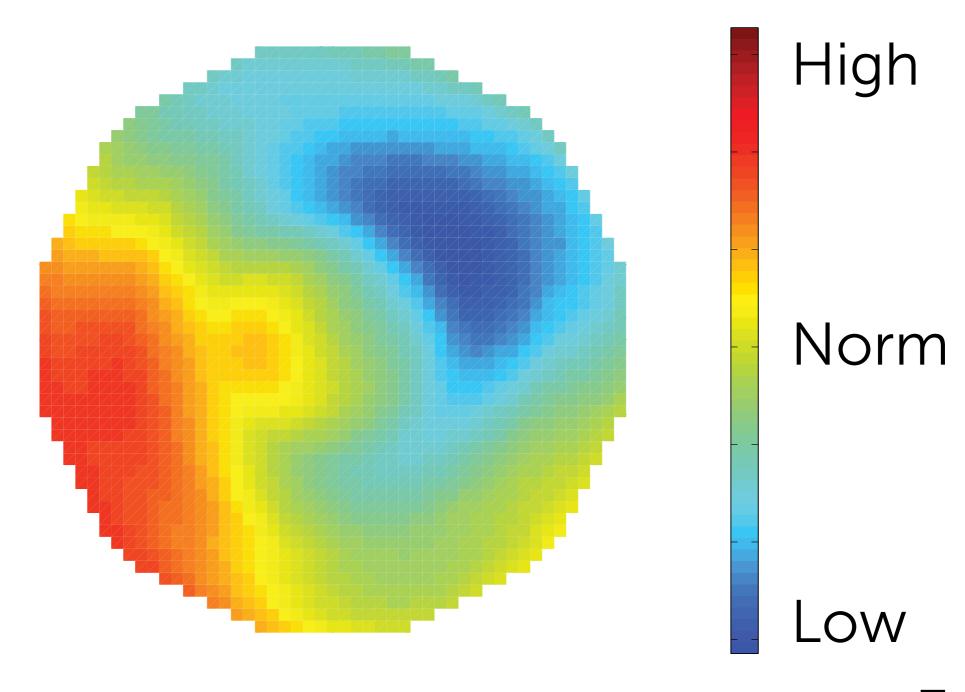




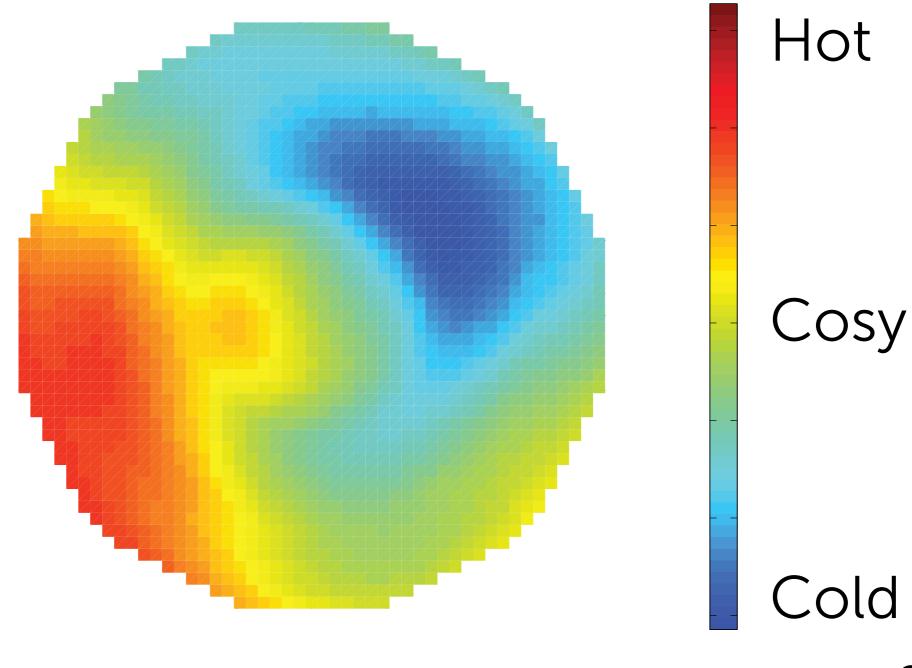




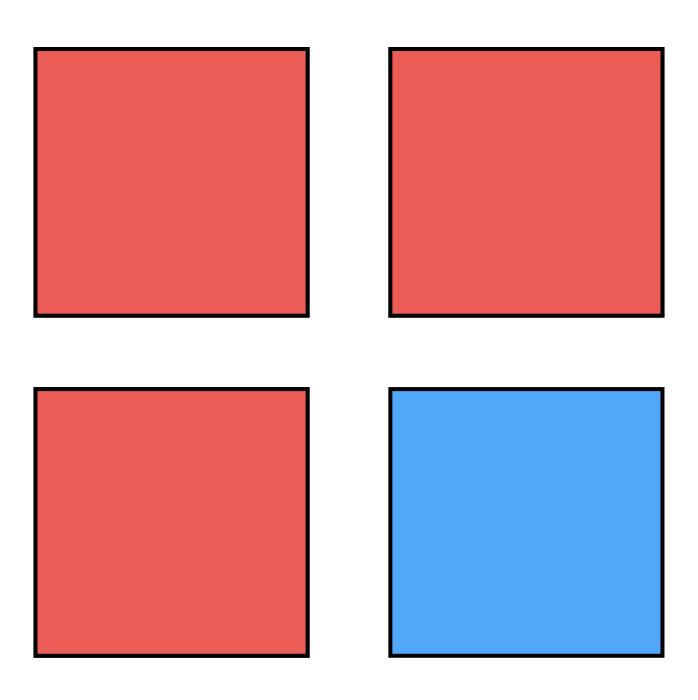




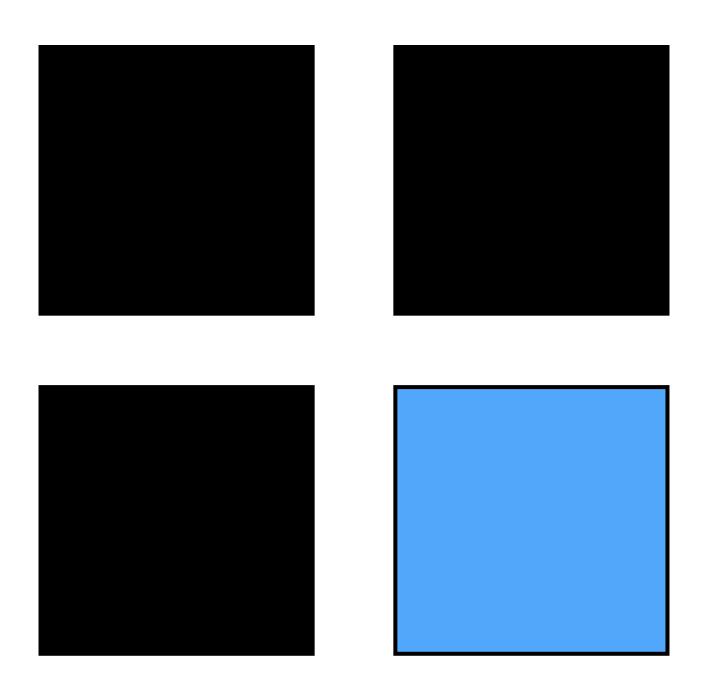
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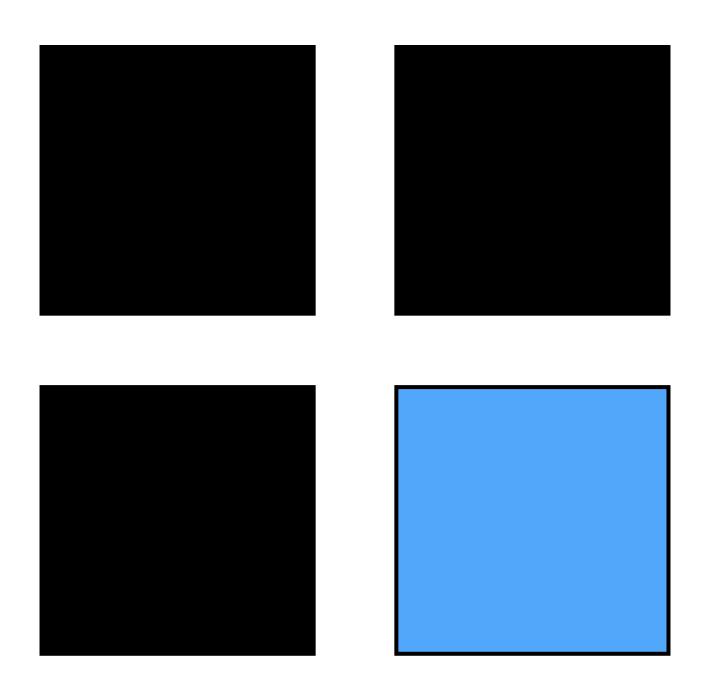
# Temperature



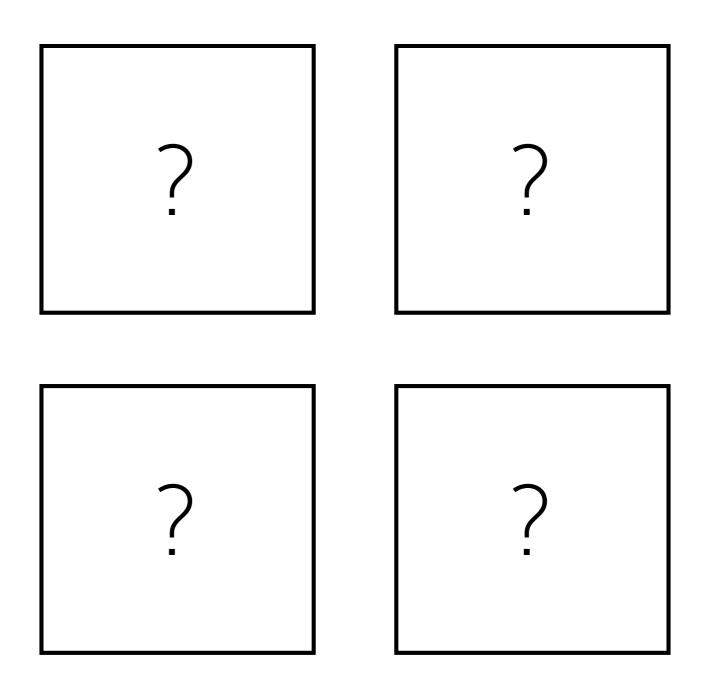
# Temperature



# Uncertainty



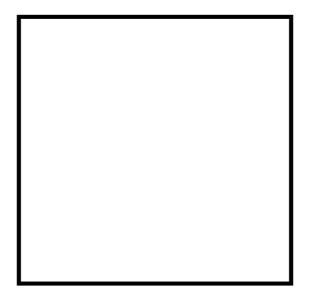
# Uncertainty



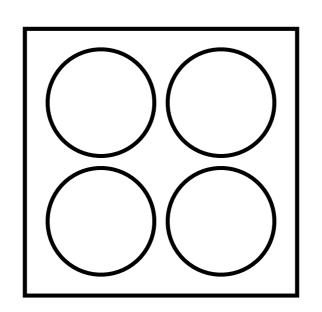
#### Our Work

 Accurate and efficient characterization of uncertainty

# Electronic System

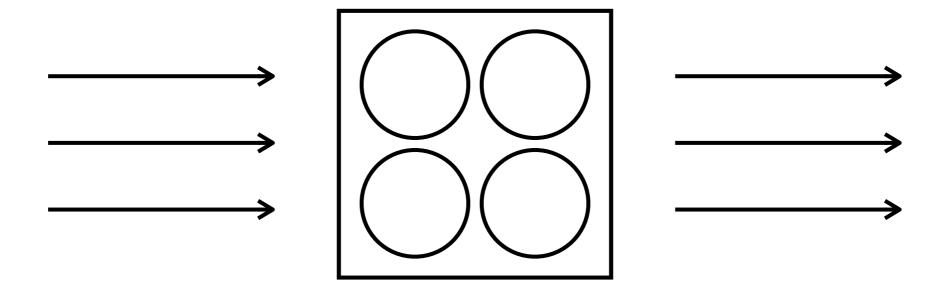


# Electronic System

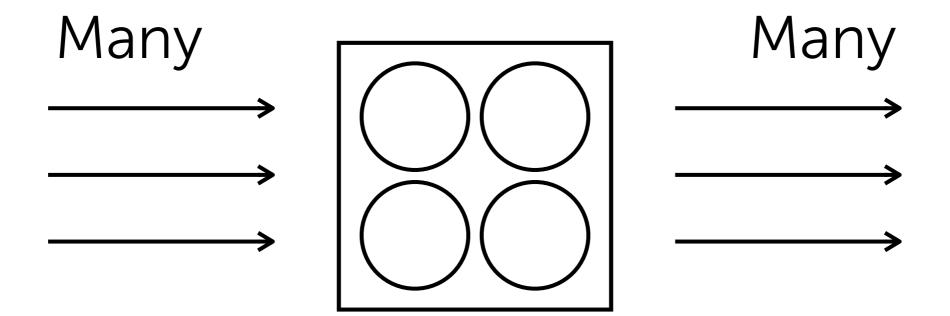


# Electronic System

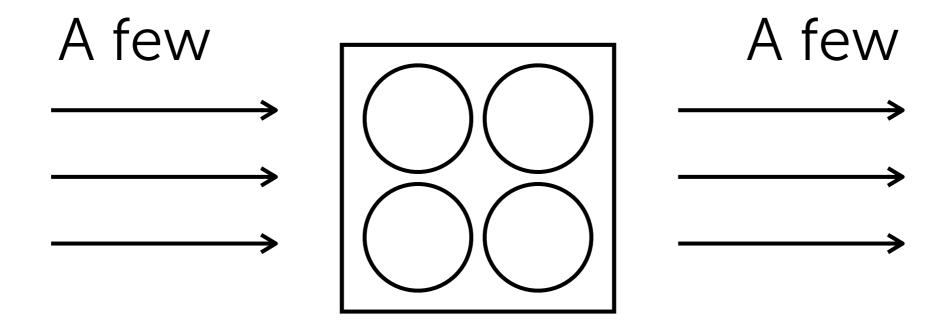
#### Deterministic



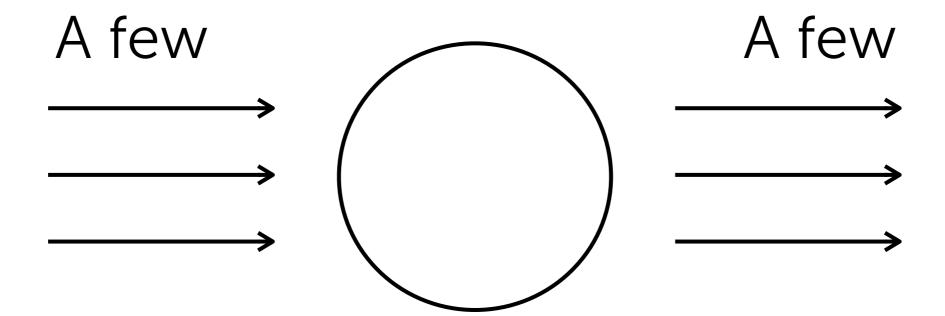
#### Monte Carlo



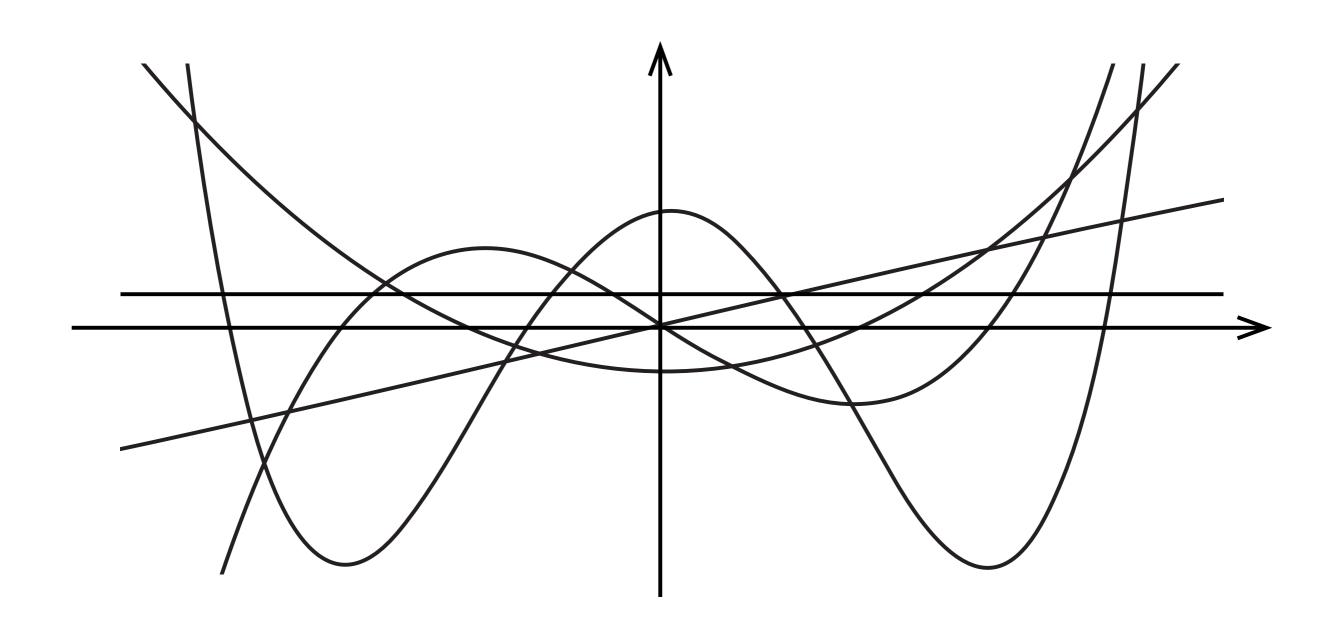
#### Our Work



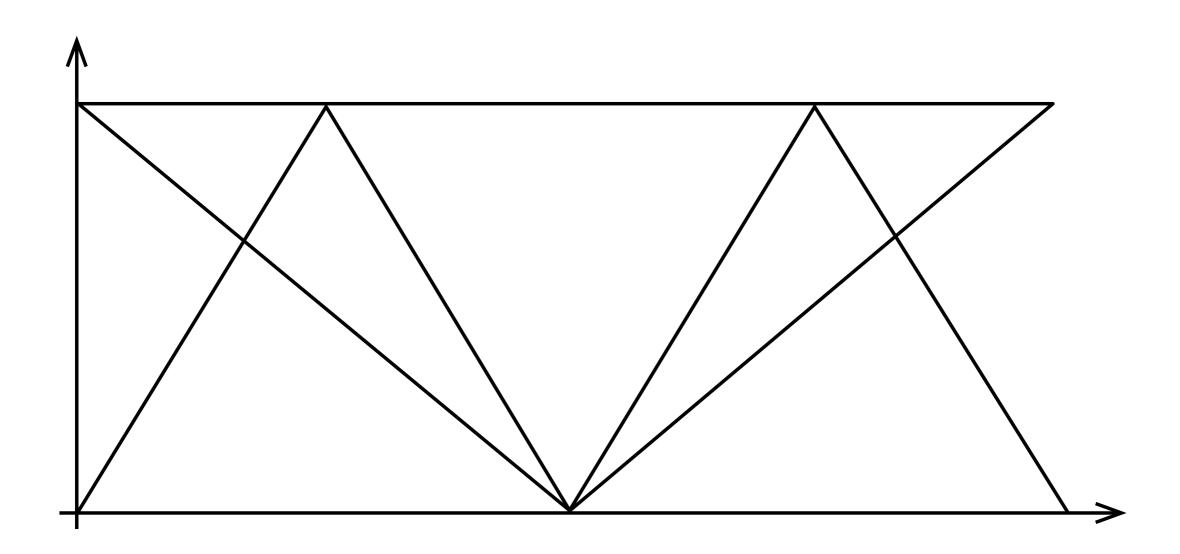
#### Our Work



# Polynomial Chaos



# Adaptive Interpolation



# Thank you! Questions?

https://www.ida.liu.se/~ivauk83