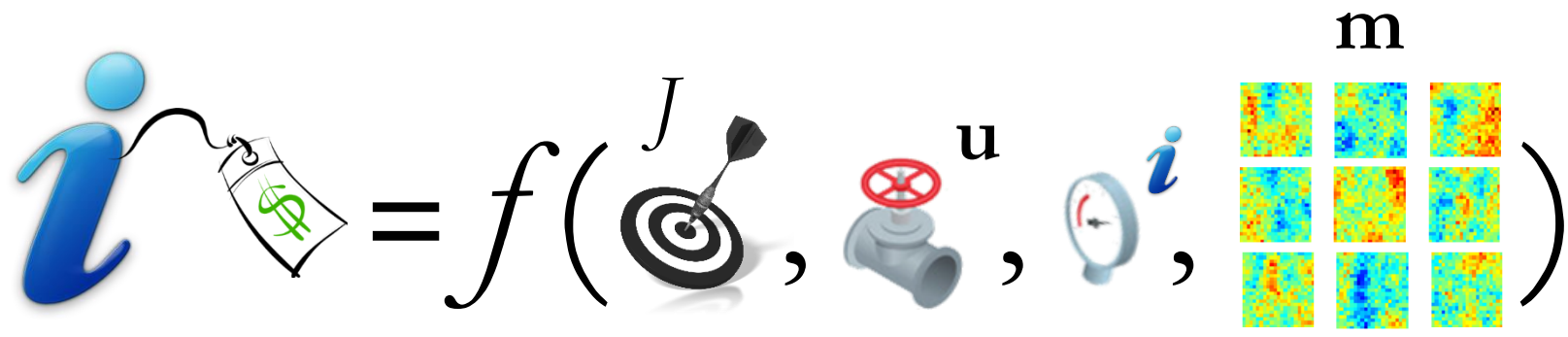


VALUE OF INFORMATION IN CO₂ STORAGE

Eduardo Barros, TNO



TNO innovation
for life



Pre-ACT workshop WP3, TNO Utrecht
21-2-2018

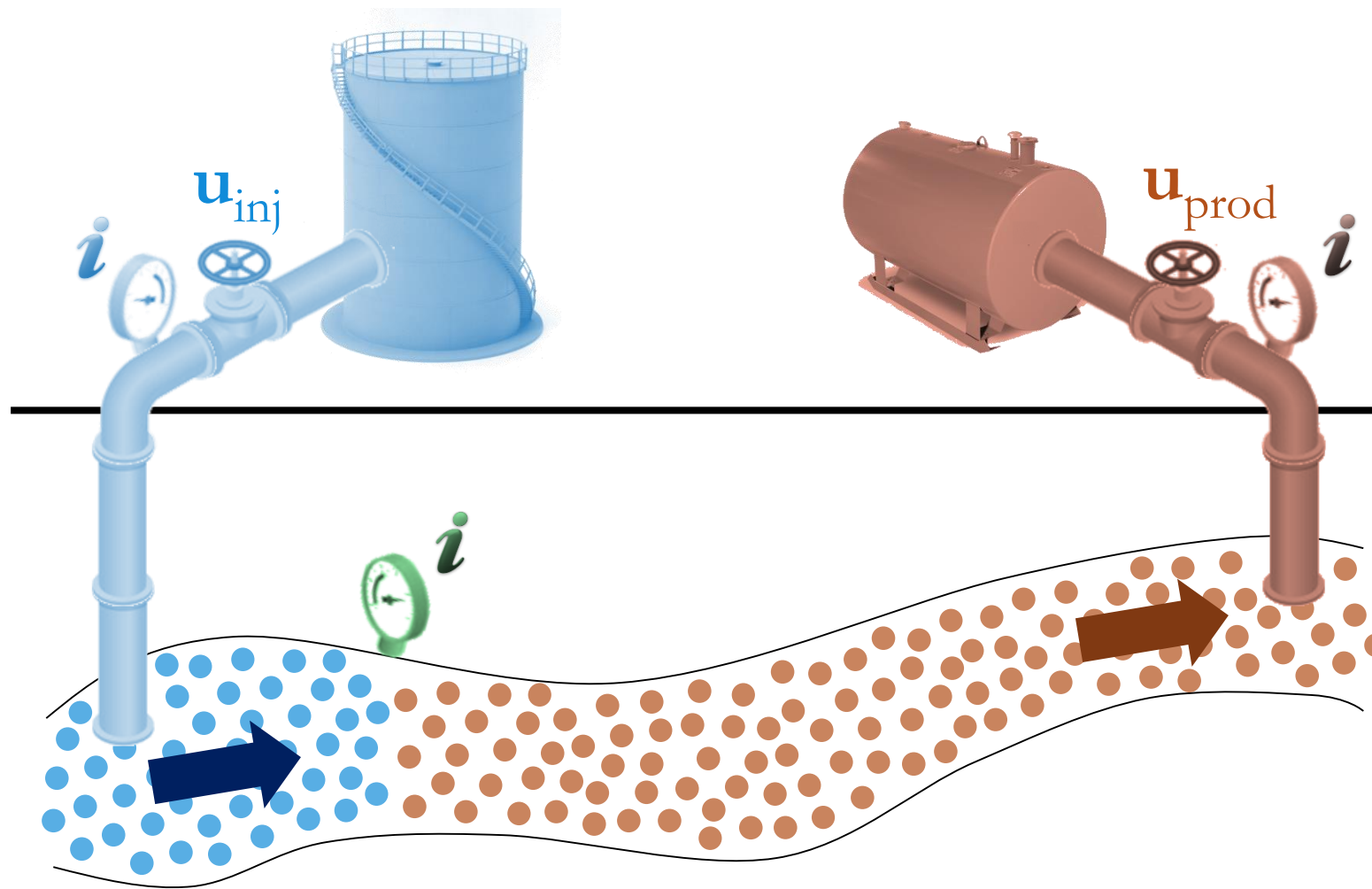
OUTLINE

- › Background
- › Value of information
- › Conformance in CO₂ storage
- › Concluding remarks

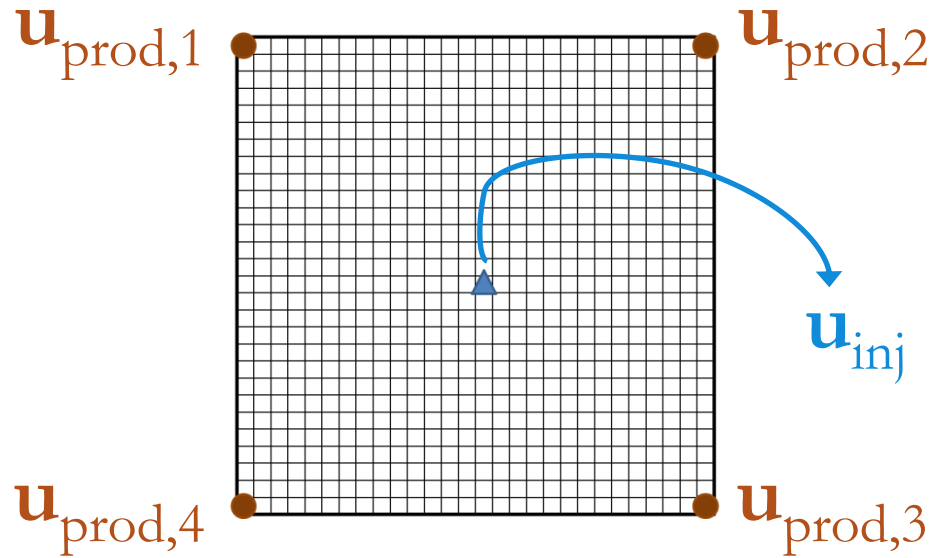
OUTLINE

- › Background
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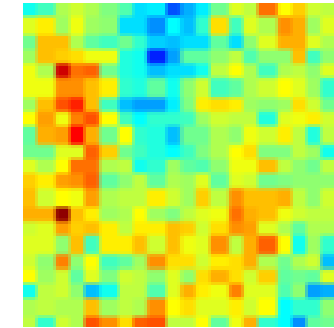
RESERVOIR MANAGEMENT



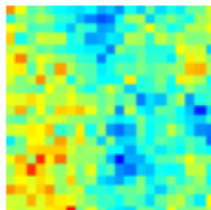
GEOLOGICAL UNCERTAINTY



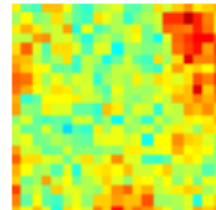
Real reservoir



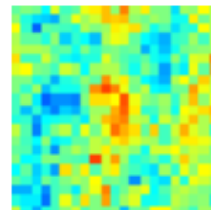
m_1



m_2

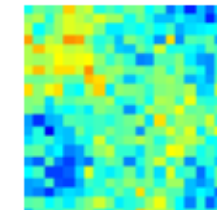


m_3

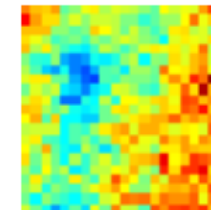


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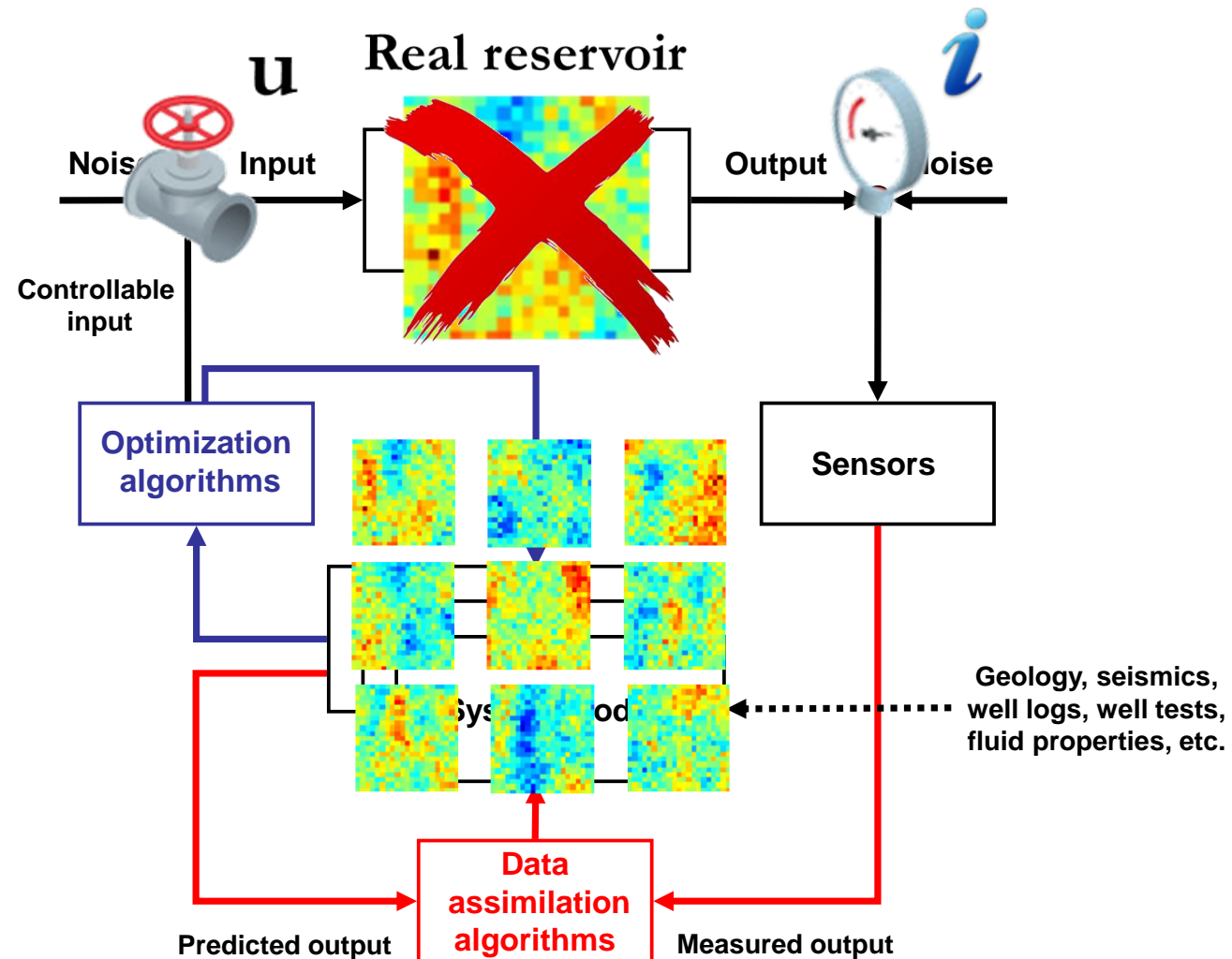
m_{N-1}



m_N



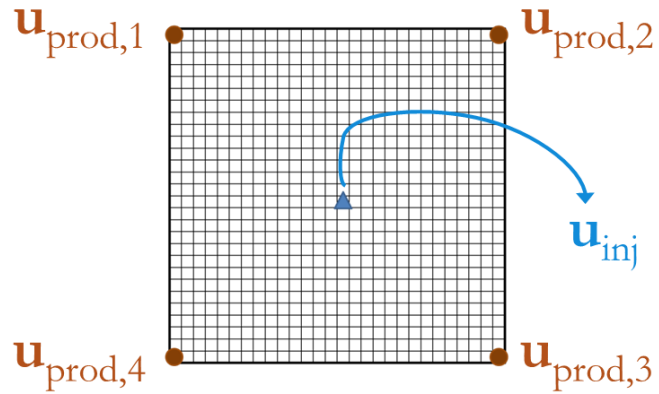
CLOSED-LOOP FRAMEWORK



OUTLINE

- › Background
- › Value of information
- › Conformance in CO₂ storage
- › Concluding remarks

VALUE OF INFORMATION (VOI)



› Production strategy



› Reservoir surveillance

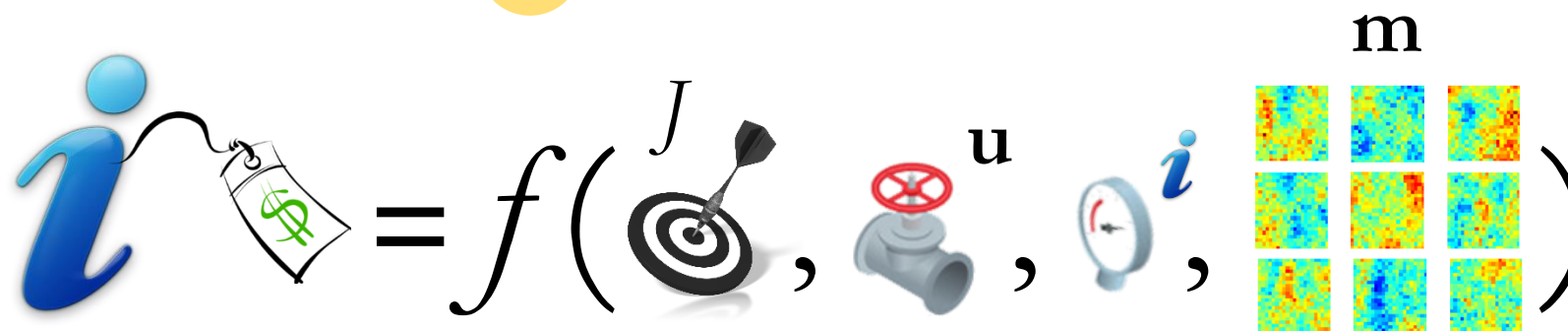


VOI assessment in reservoir management

$$i = f \left(J, u, i, m \right)$$

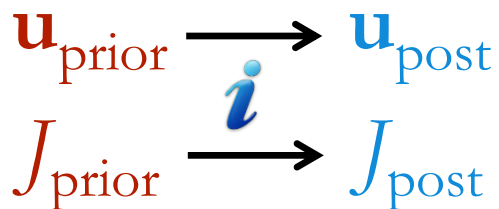
VOI ASSESSMENT

1



To evaluate VOI for a given measurement scenario:

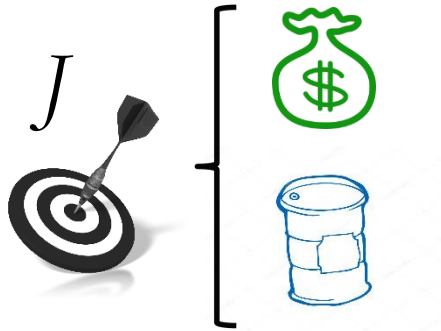
- › fixed i
- › u changes $\rightarrow J$ changes



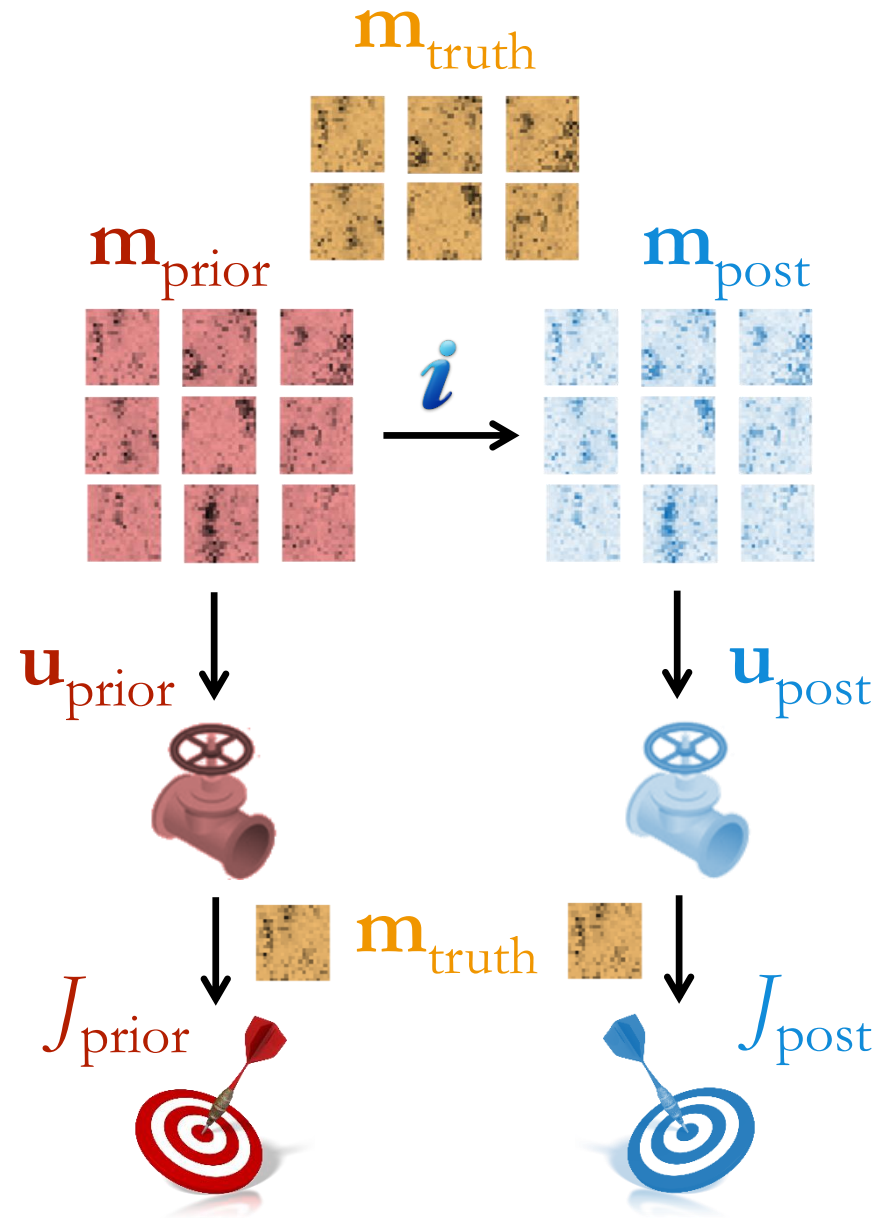
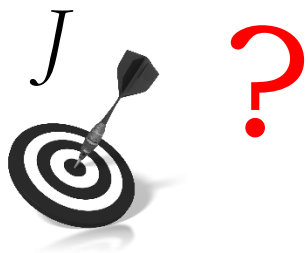
$$VOI = J_{\text{post}} - J_{\text{prior}}$$

VOI ASSESSMENT 1

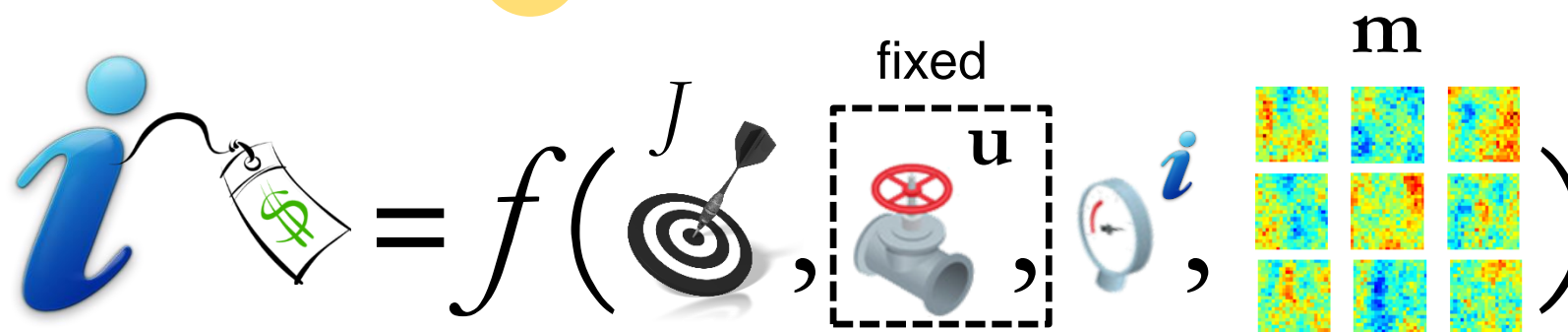
› Production optimization



› CO₂ storage



VOI ASSESSMENT 2



To evaluate VOI for a given measurement scenario:

- > **u** is fixed
- > **i** → **J** changes

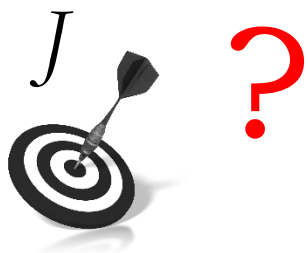
$$\begin{aligned} \emptyset &\longrightarrow J_{\text{without}} \\ \mathbf{i} &\longrightarrow J_{\text{with}} \end{aligned}$$

$$\text{VOI} = J_{\text{with}} - J_{\text{without}}$$

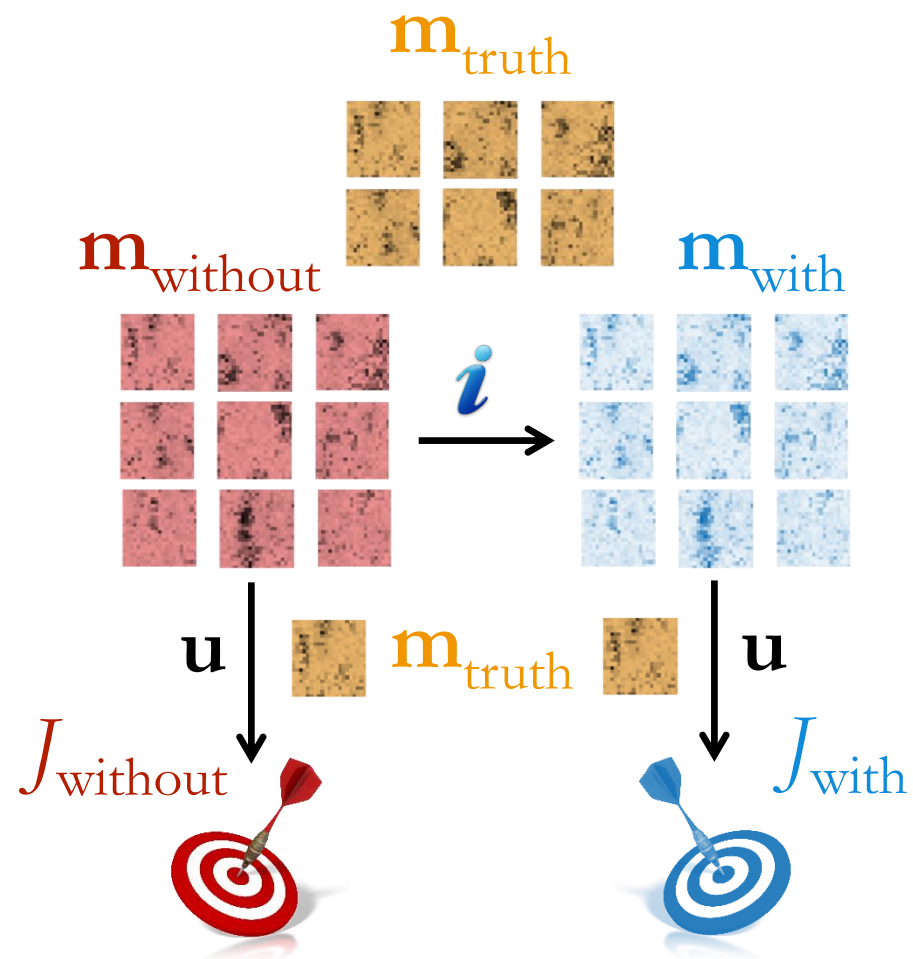
VOI ASSESSMENT

2

› CO₂ storage




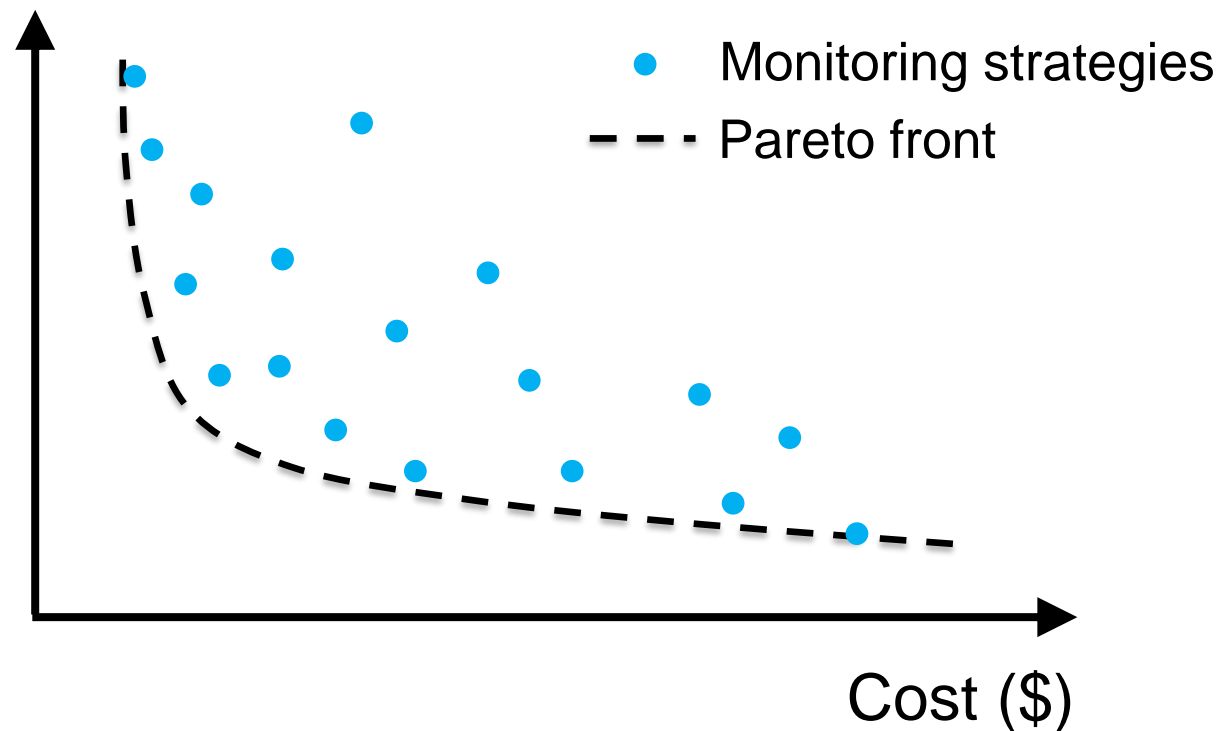
- Conformance



DESIGN OF MONITORING STRATEGIES

$$\text{VOI} = J_{\text{with}} - J_{\text{without}}$$

(in J units)

REFERENCE FOR VOI ASSESSMENT

› Data addition:

$$\emptyset \longrightarrow J_{\text{without}}$$

$$i \longrightarrow J_{\text{with}}$$

$$\text{VOI} = J_{\text{with}} - J_{\text{without}}$$

› Data denial:

$$\{i_1, i_2, i_3, i_4\} \longrightarrow J_{\text{all}}$$

$$\{\emptyset, i_2, i_3, i_4\} \longrightarrow J_{\text{subset}}$$

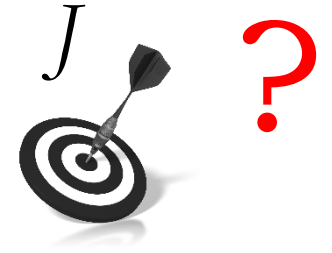
$$\text{VOI} = J_{\text{all}} - J_{\text{subset}}$$

OUTLINE

- › Background
- › Value of information
- › Conformance in CO₂ storage
- › Concluding remarks

CONFORMANCE IN CO₂ STORAGE

(I) Model × measurement conformance



- Conformance

a) Conformance?

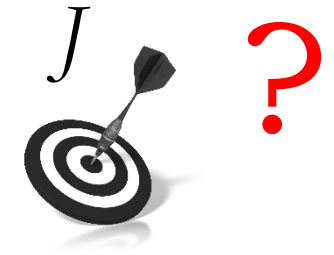
- We can only quantify **non-conformance** (i.e., **deviations**)
- In **history matching**, we minimize **mismatches** between model predictions and measured data
- Here we are interested in minimizing **deviations** in the **future** (i.e., no measurements available yet)

b) How do we compute non-conformance given an **ensemble of realizations** and **different sources of information**?

- We need a **unified measure** so that we can compare different monitoring systems

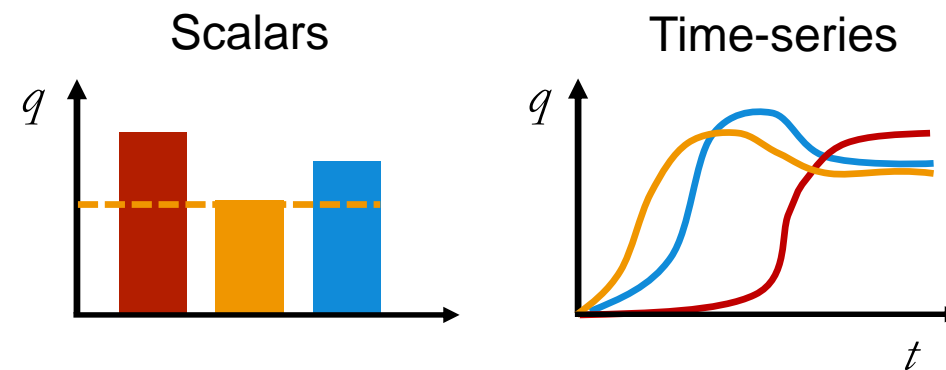
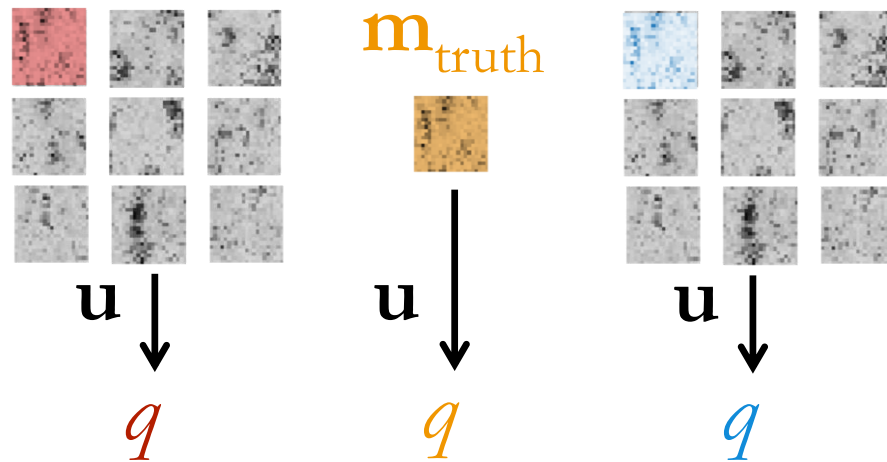
CONFORMANCE IN CO₂ STORAGE

(I) Model × measurement conformance

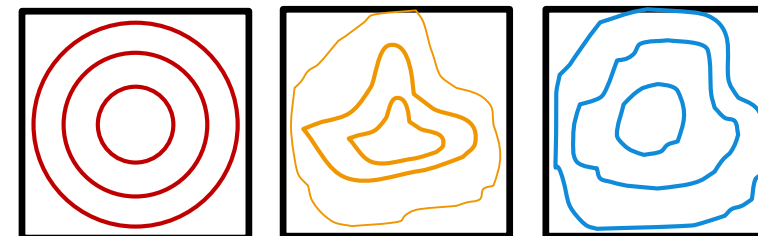


- Conformance

c) Quantity of interest, q : measurement or forecast variables?



Maps



$$J_{\text{without}} = |q - q|$$

$$J_{\text{with}} = |q - q|$$

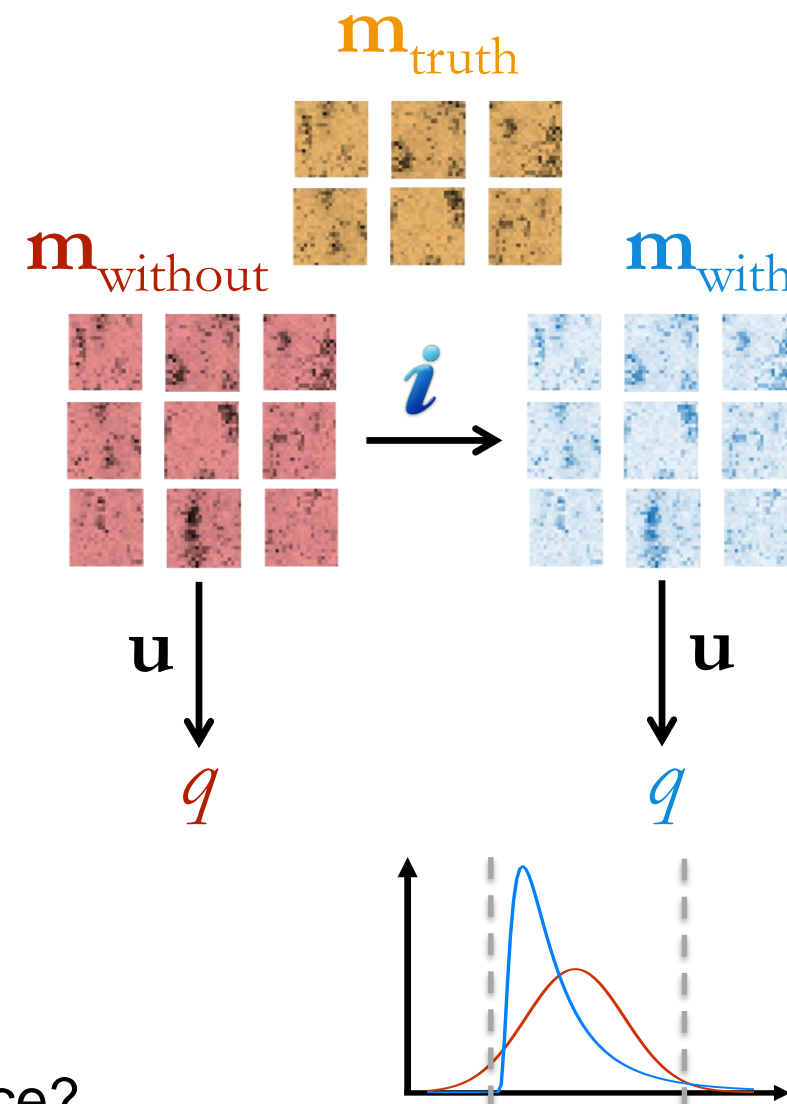
CONFORMANCE IN CO₂ STORAGE

(II) Model uncertainty

- d) **Spread** of quantity of interest, q :
- std. deviation, $P_{90} - P_{10}$, min - max, ...
 - Based on model forecasts

(III) Model × regulation conformance

- e) Clearly defined **bounds** for the quantity of interest
- Model forecasts to quantify confidence on meeting these requirements
- f) **Measurements for verification** of this type of conformance?



OUTLINE

- › Background
- › Value of information
- › Conformance in CO₂ storage
- › Concluding remarks

CONCLUDING REMARKS

- › **Complete VOI assessment** in reservoir management
 - › Impact of measurements on **operational decisions** (incl. **optimization**)
 - › What are the operational decisions in CO₂ storage?
 - › Injection rates/pressures? Location of brine discharge wells?
 - › **Computationally demanding** workflows
- › New idea for VOI assessment in CO₂ storage
 - › Fixed operational decisions → More practical workflows
 - › Conformance is the target
 - › Types of conformance:
(I) Model × measurement, (II) Model uncertainty, (III) Model × regulation

CONCLUDING REMARKS

- › Importance of **unified measure** of conformance
- › Who defines the **boundary** between **conformance / non-conformance**?
 - › Acceptable bounds → regulation?
- › Design of monitoring strategies for conformance verification
 - › We need to consider **scenarios** that will lead to non-conformance
 - › Simulated measurements from **plausible true-models**
 - › We cannot assess VOI in cases with *unknown unknowns*
- › Risk of designing a system based on a measure
 - › **Observed non-conformance** × **Actual non-conformance**

THANK YOU FOR YOUR ATTENTION

TIME FOR DISCUSSION!

$$i = f\left(J, u, i, \begin{matrix} m \\ \text{Heatmaps} \end{matrix}\right)$$

$$\text{VOI} = J_{\text{with}} - J_{\text{without}}$$

(in J units)

