# A review of problems and methods of optimising sensor grids for CO<sub>2</sub> pipeline transport networks

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# Background

- In Carbon Capture and Storage (CCS), pipelines provide the most economical and safe way to transport CO<sub>2</sub>, [2].
- Monitoring and Control (M&C) of CO<sub>2</sub> transporting pipelines are essential for various purposes, e.g., flow assurance and anomaly

### **M&C feedback loop**

CO<sub>2</sub> collecting and









2

**Optimal sensor placement is one of** the main parts of optimising the monitoring system.

**Aims of the literature review** 

- Identify objectives for monitoring of 1. non-CO<sub>2</sub> (water, oil, natural gas) pipeline systems that are necessary for monitoring CO<sub>2</sub> pipelines.
- **Classify optimisation problems and the** 2. relevant algorithms of optimal sensor placement for the objectives in 1.

<b>3</b> The literat	The literature review findings (1): Monitoring system objectives			es
Transported fluid	Leak Detection	Components	Flow control	Fluid Phase
Water	$\checkmark$	<ul> <li>✓ (Contaminants)</li> </ul>	$\checkmark$	Not relevant
Oil	$\checkmark$	Not relevant	$\checkmark$	Not relevant
Natural gas	$\checkmark$	Not relevant	$\checkmark$	Not relevant
CO <sub>2</sub>	$\checkmark$	<ul><li>✓ (Impurities)</li></ul>	$\checkmark$	$\checkmark$

The literature review findings (2): Sensor placement optimisation problem and algorithms [4][5][7][8]

#### **Optimising variables** Monitoring system objectives

**Algorithms/ Methods** 

Leak detection	Sensor locations, detection probability, detection time, the number of sensors	Genetic Algorithm, Greedy Algorithm, Multi-Integer Linear Programming (MILP)	
Components detection	Detection time, detection probability, the number of sensors	Genetic Algorithm, K-means clustering, Multi-Objective Evolutionary Algorithm (MOEA)	
Flow control (flow rate/pressure)	Sensor locations, pipe coverage, measurement accuracy, the number of sensors	Genetic Algorithm, Monte-Carlo approach	





- The phase of CO<sub>2</sub> stream is sensitive to impurities (see the plot on left), a wide range of two-phase area with low impurity level, adding the difficulty to the flow assurance.
- $\succ$  The operation conditions for CO<sub>2</sub> transport (especially in the <u>supercritical</u> phase) are different from other pipeline systems, e.g., the temperatures are to be monitored for the flow assurance.
- Fluid phase needs to be directly measured or computed to avoid two-phase flow.

# Conclusions

- > The literature review findings can be used to inform optimising monitoring of CO<sub>2</sub> pipelines.
- > Special adaptations (e.g., monitor fluid phase and temperature) are needed for the flow assurance due to CO<sub>2</sub> physical behaviours.

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