



## AI-based Approaches for Short- and Long-term Sewer Asset Management in Berlin (Germany)

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# From defects to deterioration models



Defect coding



Pipe assessment

Condition	Need for action
Good	None / Long term
Fair	Mid term
Bad	Short term
Very Bad	Immediate

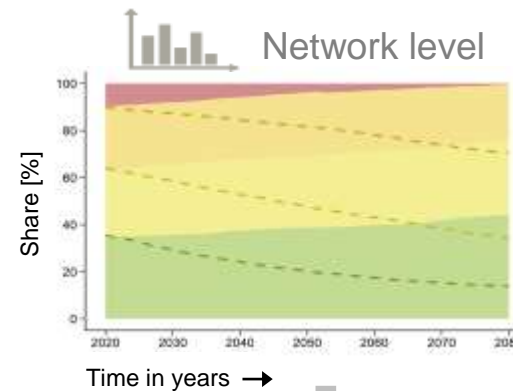


## Deterioration factors

- 🏠 Age    🧱 Material    🚰 Drainage type    ● Shape
- 📏 Width    📐 Length    ⚙️ Slope    🌱 Soil type and coverage
- 💧 Groundwater coverage    🌳 Trees    🏘️ District



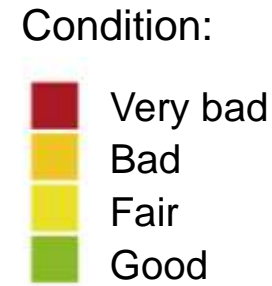
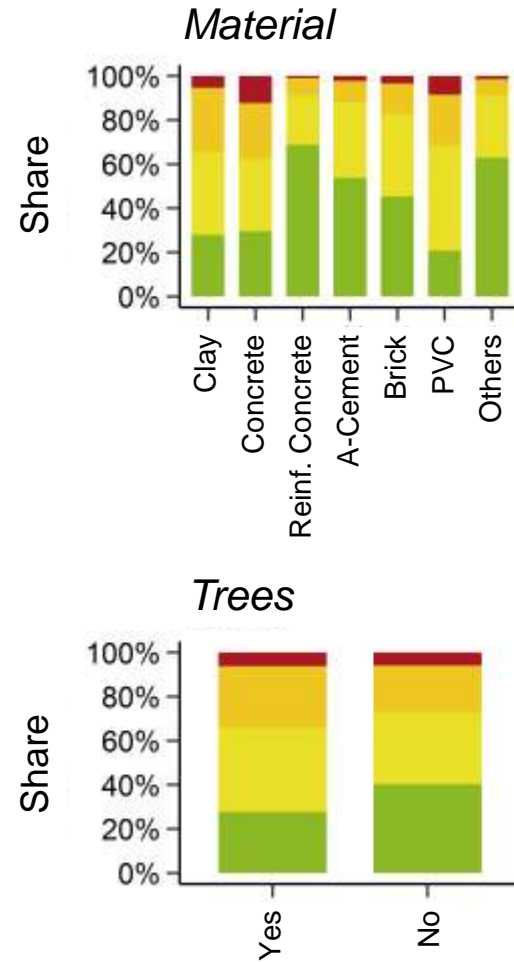
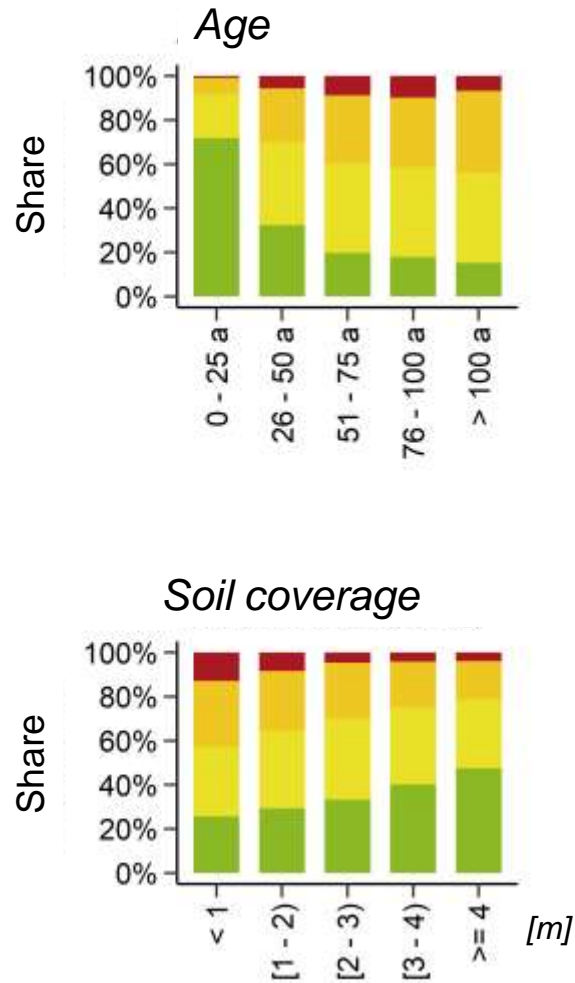
## Model predictions











Status quo



# Deterioration factors

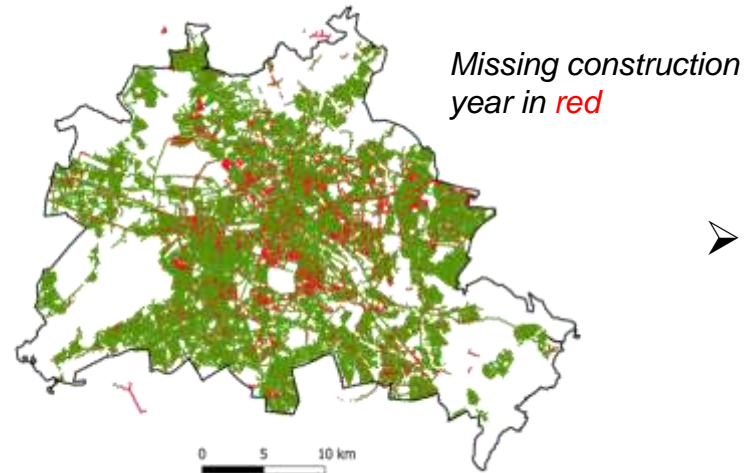
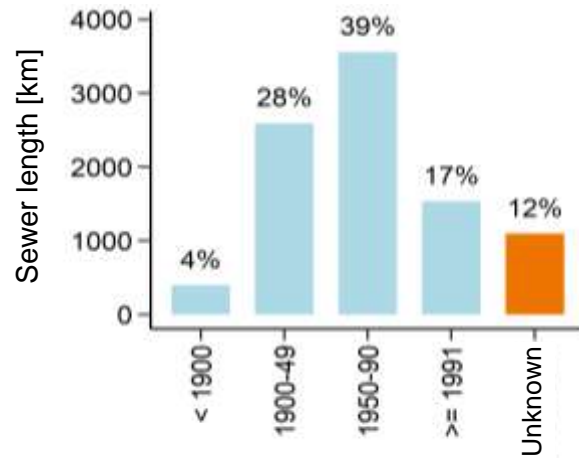


Other variables:

-  Sewerage type
-  Width
-  Shape
-  Length
-  Slope
-  Soil type
-  Groundwater coverage
-  District

# Filling gaps in sewer asset data

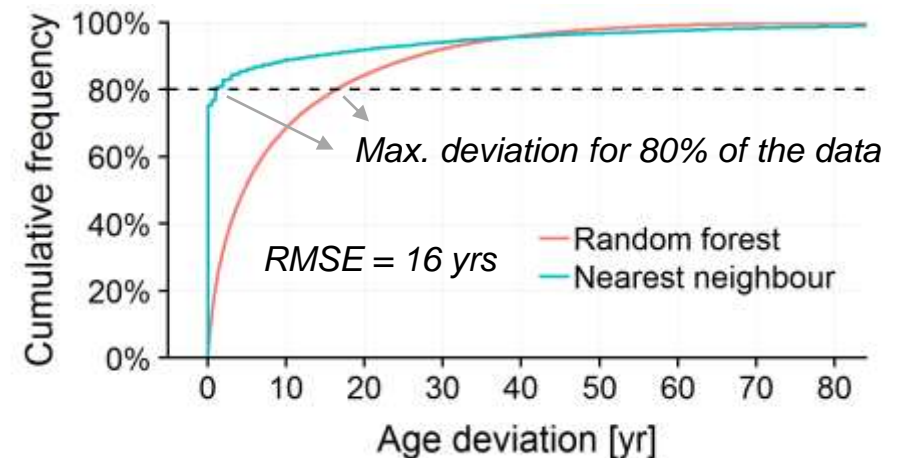
## Construction year / pipe age



➤ Very similar problem in data of most cities

**Method:** Nearest neighbour model + Random Forest machine learning approach under consideration of sewer pipe characteristics and environmental factors

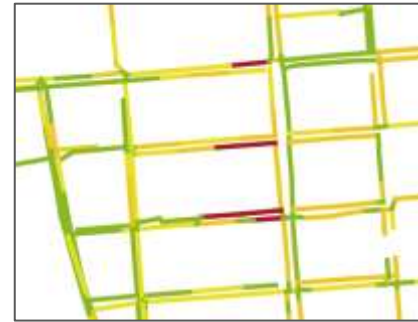
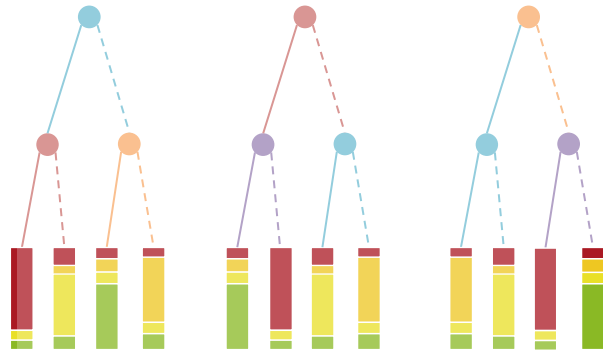
**Results:** i) Accurate prediction of age for majority of pipes; ii) Symmetric error distribution; iii) All gaps can be closed by combining both approaches



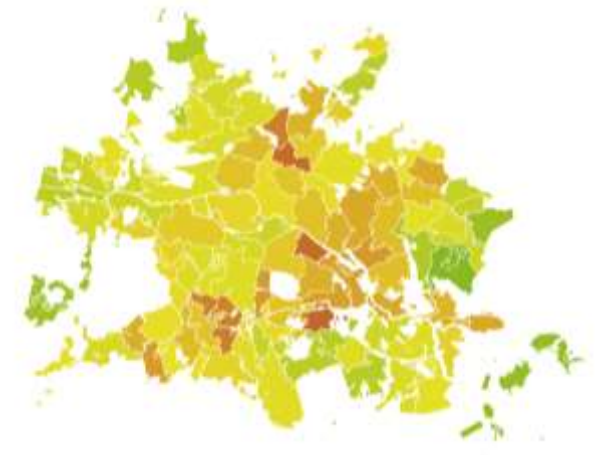
# I. Pipe simulator

**Goal:** Prioritisation of pipes with high probability of defects to support short-term inspection planning

Random Forest



Hotspots at pipe level



Area prioritisation

*Variables:*

*Pipe characteristics*



*Environmental factors*

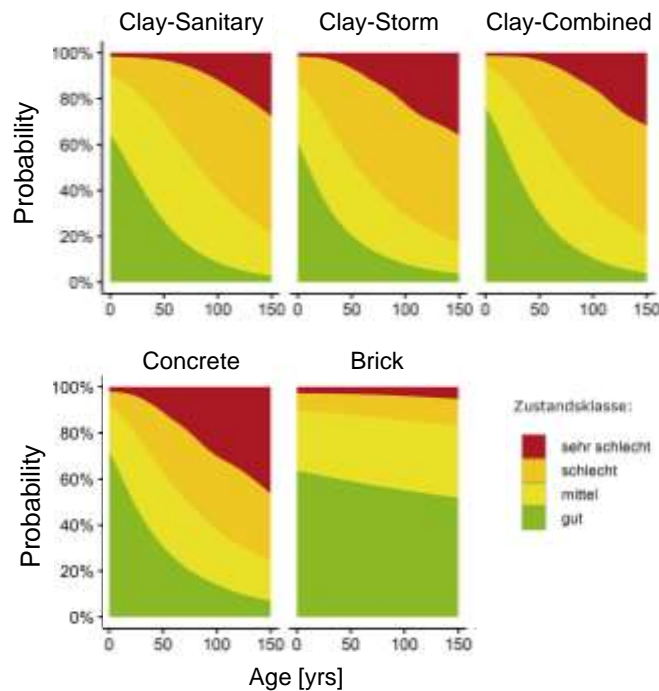


- Model finds about 4 times more defect pipes than current strategic inspections
- Valuable information for efficient inspection programs

## II. Strategy simulator

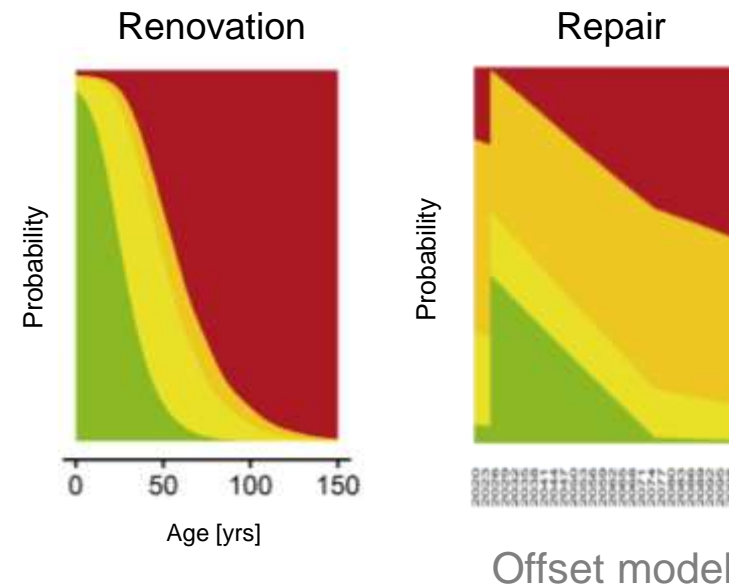
**Goal:** Long-term predictions for sewer network condition and strategic rehab planning

### Deterioration model



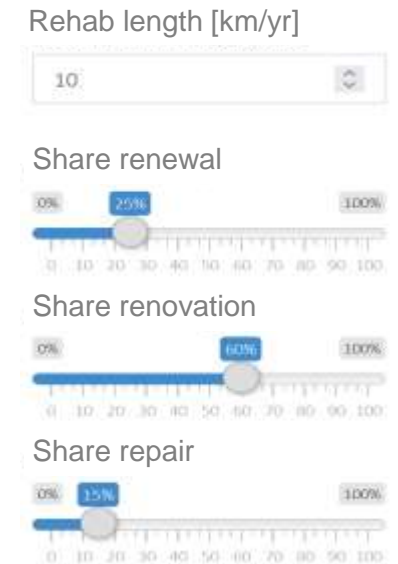
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### Rehabilitation components



Estimated survival curves

### Strategy configurator



Statistical regression model based on survival curves for different pipe cohorts

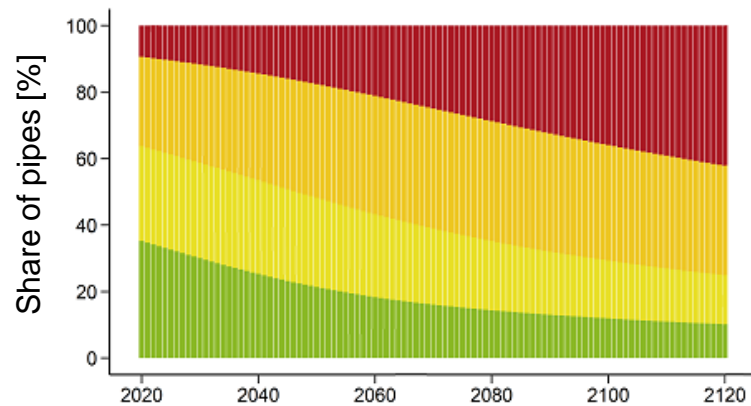
Variables:    



## II. Strategy simulator

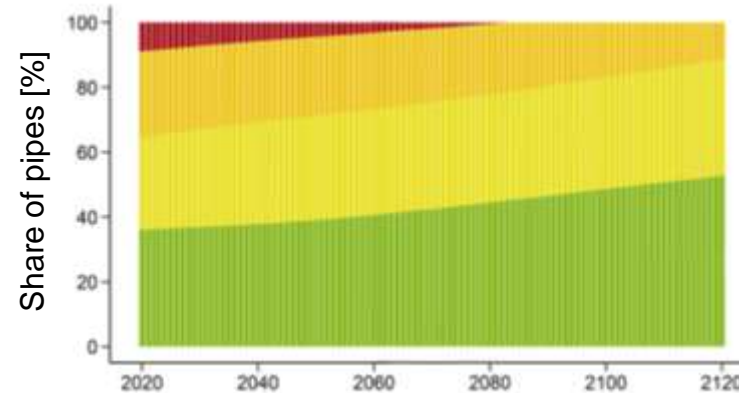
### Condition distribution for different rehab strategies

A. "Do nothing"



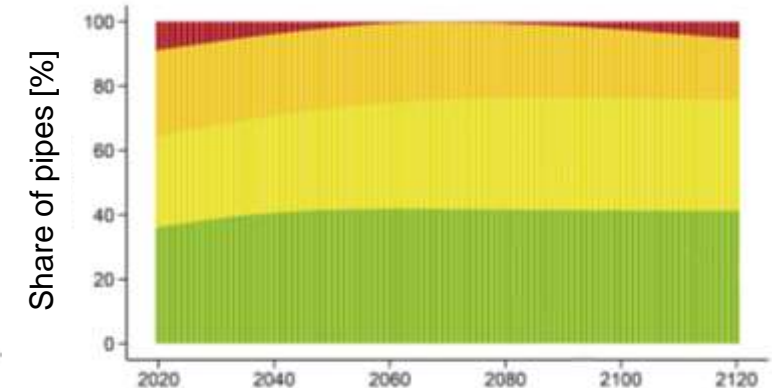
- constant increase in the share of pipes with severe defects (0.3% per year)

B. Renewal strategy (1%/a)



- Continuous improvement of condition, but limited by high costs and other constraints

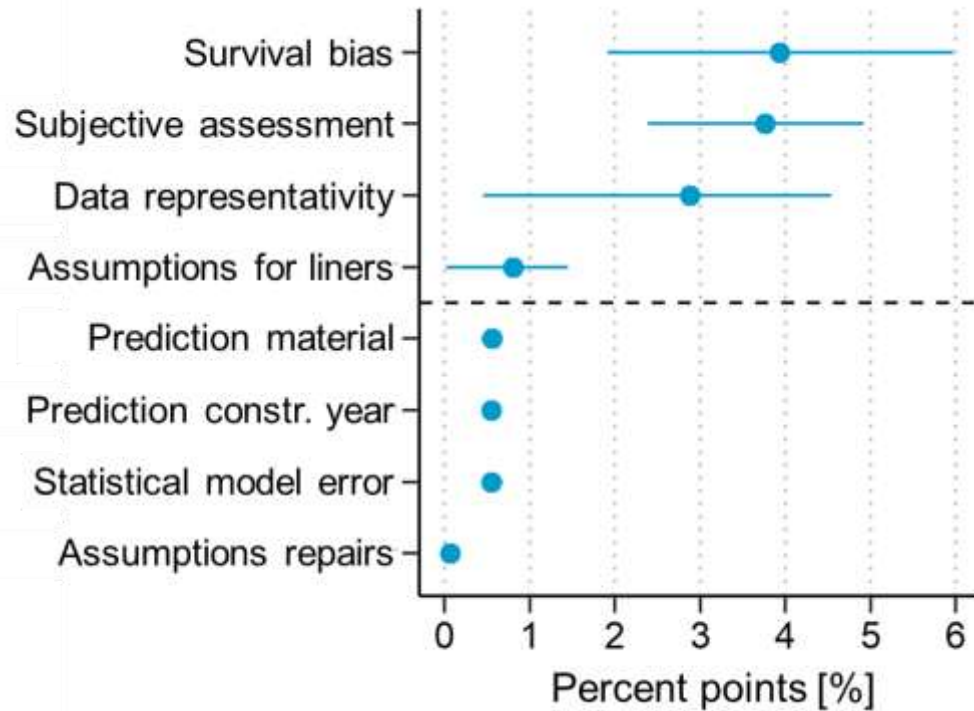
C. Mixed rehab strategy (1,1%/a, renewal + renovation + repairs)



- Short-term condition improvement followed by deterioration → effect of liners

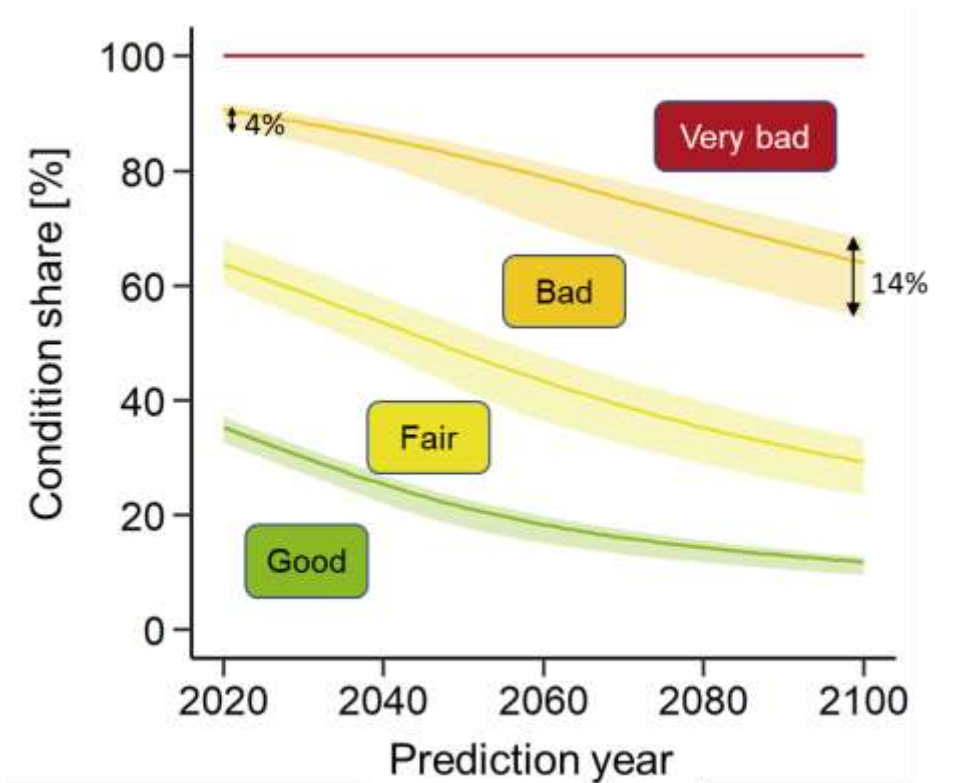
# Model uncertainties

Ranking of uncertainty sources:



(= Relevance over time)

Total uncertainties for a do-nothing simulation:



- Assumptions on liners can become major source of uncertainty for a given rehab strategy



## Summary and conclusions

- The **strategy simulator** can support utilities in long-term planning of efficient rehabilitation and investment strategies
- The **pipe simulator** prioritises pipes according to their defect probability, allowing for more efficient inspection programs
- Data gaps can be filled with reliable ML-based prediction models
- Important uncertainty sources and countermeasures identified
- Both simulation tools are planned to be tested in other cities



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