Modelling the Deterioration of Infrastructures Using Network-Scale Visual Inspections

Zachary Hamida (Postdoc) & James-A. Goulet (Professor)

Polytechnique Montréal, Canada Department of civil geological and mining engineering

August, 2022

MTQ Partner

Definitions

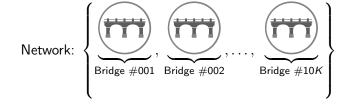
Visual Inspections (VI): Network-scale monitoring technique

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Network:

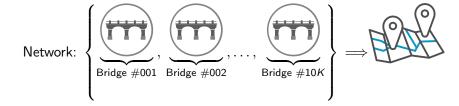
2/12

Visual Inspections (VI): Network-scale monitoring technique



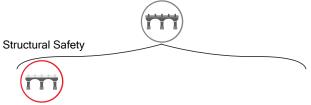
Context & Objectives

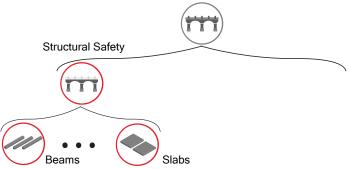
Visual Inspections (VI): Network-scale monitoring technique

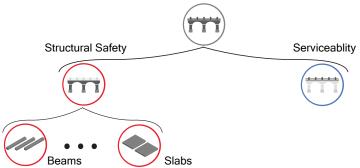


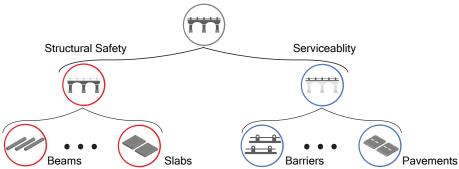
Data Hierarchy

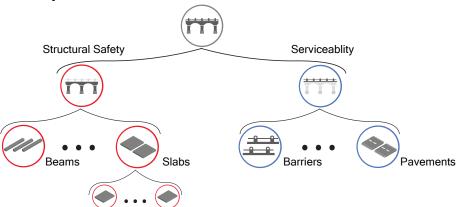




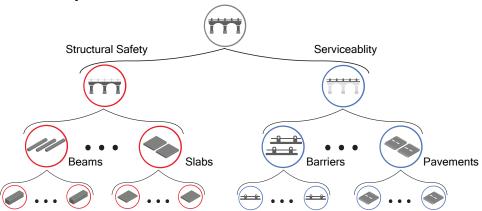








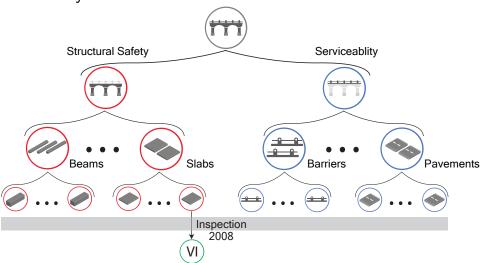
Data Hierarchy



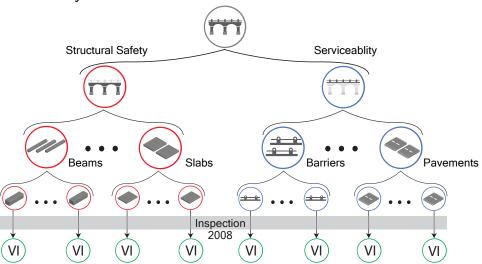
Source: MTQ, Manual of Inspection

3/12

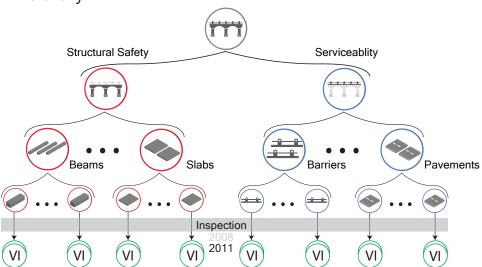
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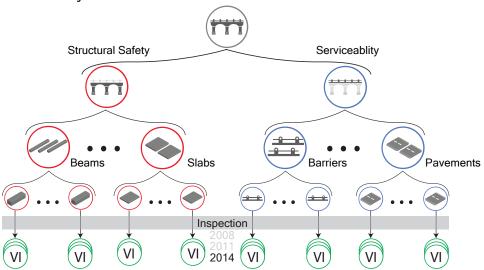
Data Hierarchy



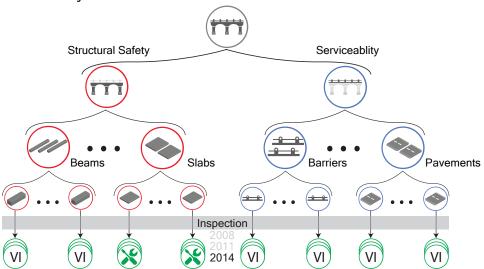
00000 Definitions



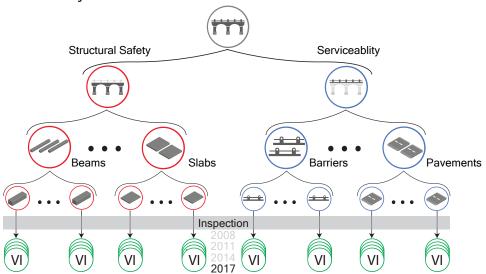
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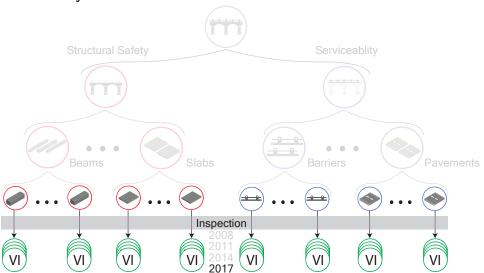
Data Hierarchy



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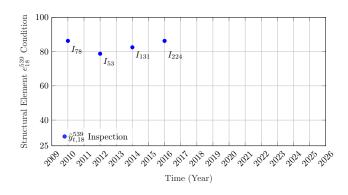


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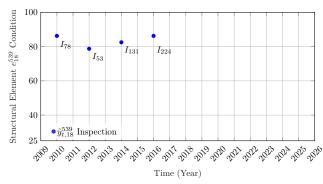
Example of Visual Inspections on a Structural Element





Example of Visual Inspections on a Structural Element

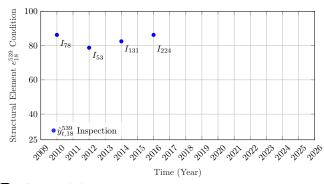




Limited data.

Example of Visual Inspections on a Structural Element

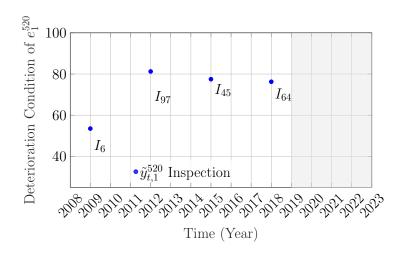




- Limited data.

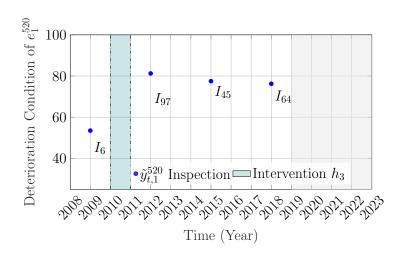
Example of Visual Inspections with an Intervention





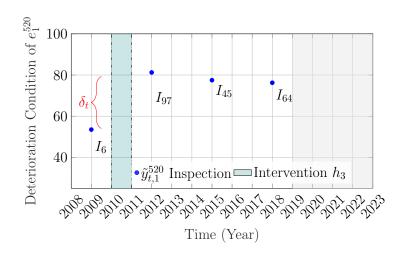
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Example of Visual Inspections with an Intervention





5/12

Objectives

Context & Objectives

Modelling infrastructures deterioration from network-scale visual inspections.

Objectives

- Modelling infrastructures deterioration from network-scale visual inspections.
- Quantifying the effects of interventions based on visual inspections.

Kinematic Equations

$$x_{t+1} = x_t + \dot{x}_t \Delta t + \frac{1}{2} \ddot{x}_t \Delta t^2 + w$$
 (Condition)

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$$x_{t+1} = x_t + \dot{x}_t \Delta t + \frac{1}{2} \ddot{x}_t \Delta t^2 + w$$
 (Condition)
 $\dot{x}_{t+1} = \dot{x}_t + \ddot{x}_t \Delta t + \dot{w}$ (Speed)

Source: Hamida and Goulet, 2020

7 / 12

Kinematic Equations

$$\begin{array}{lll} x_{t+1} &=& x_t + \dot{x}_t \Delta t + \frac{1}{2} \ddot{x}_t \Delta t^2 + w & \text{(Condition)} \\ \dot{x}_{t+1} &=& \dot{x}_t + \ddot{x}_t \Delta t + \dot{w} & \text{(Speed)} \\ \ddot{x}_{t+1} &=& \ddot{x}_t + \ddot{w} & \text{(Acceleration)} \end{array}$$

Source: Hamida and Goulet, 2020

7 / 12

$$\underbrace{\begin{bmatrix} x_t \\ \dot{x}_t \\ \ddot{x}_t \end{bmatrix}}_{\mathbf{x}_t} = \underbrace{\begin{bmatrix} 1 & \Delta t & \frac{\Delta t^2}{2} \\ 0 & 1 & \Delta t \\ 0 & 0 & 1 \end{bmatrix}}_{\mathbf{A}} \cdot \underbrace{\begin{bmatrix} x_{t-1} \\ \dot{x}_{t-1} \\ \ddot{x}_{t-1} \end{bmatrix}}_{\mathbf{x}_{t-1}} + \underbrace{\begin{bmatrix} w_t \\ \dot{w}_t \\ \ddot{w}_t \end{bmatrix}}_{\mathbf{w}_t}$$

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Method: State-Space Models

$$\underbrace{\begin{bmatrix} x_t \\ \dot{x}_t \\ \ddot{x}_t \end{bmatrix}}_{\mathbf{x}_t} = \underbrace{\begin{bmatrix} 1 & \Delta t & \frac{\Delta t^2}{2} \\ 0 & 1 & \Delta t \\ 0 & 0 & 1 \end{bmatrix}}_{\mathbf{A}} \cdot \underbrace{\begin{bmatrix} x_{t-1} \\ \dot{x}_{t-1} \\ \ddot{x}_{t-1} \end{bmatrix}}_{\mathbf{x}_{t-1}} + \underbrace{\begin{bmatrix} w_t \\ \dot{w}_t \\ \ddot{w}_t \end{bmatrix}}_{\mathbf{w}_t}$$

Method: State-Space Models

transition model

$$\overbrace{\mathbf{x}_t = \mathbf{A}\mathbf{x}_{t-1} + \mathbf{w}_t}$$

$$\underbrace{ \begin{bmatrix} x_t \\ \dot{x}_t \\ \ddot{x}_t \end{bmatrix}}_{\mathbf{x}_t} = \underbrace{ \begin{bmatrix} 1 & \Delta t & \frac{\Delta t^2}{2} \\ 0 & 1 & \Delta t \\ 0 & 0 & 1 \end{bmatrix}}_{\mathbf{A}} \cdot \underbrace{ \begin{bmatrix} x_{t-1} \\ \dot{x}_{t-1} \\ \ddot{x}_{t-1} \end{bmatrix}}_{\mathbf{x}_{t-1}} + \underbrace{ \begin{bmatrix} w_t \\ \dot{w}_t \\ \ddot{w}_t \end{bmatrix}}_{\mathbf{w}_t}$$

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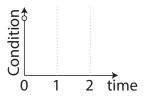
$$x_t = Ax_{t-1} + w_t$$
, $w_t : W \sim \mathcal{N}(w; 0, Q_t)$

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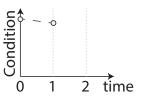


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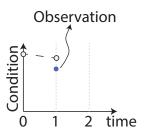


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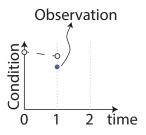
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observation model

$$y_t = Cx_t + v_t$$



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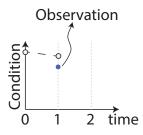
Method: State-Space Models

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$$y_t = Cx_t + v_t$$
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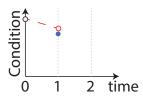
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Method: State-Space Models

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Source: Hamida and Goulet, 2020

Polytechnique Montréal

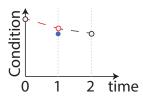
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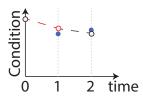
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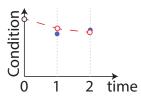
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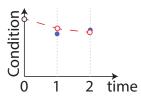
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Method: State-Space Models

transition model

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$$y_t = Cx_t + v_t$$
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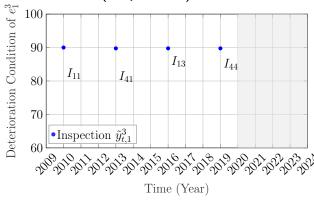


Uncertainty of Observations (Inspectors)



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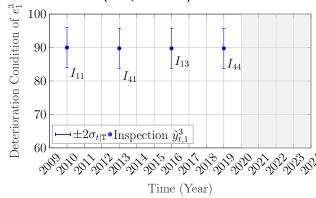




observation model

$$y_t = Cx_t + v_t$$
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observation error





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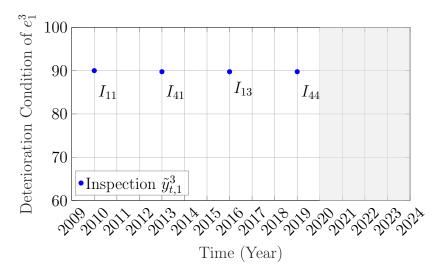


observation model

$$y_t = Cx_t + v_t$$
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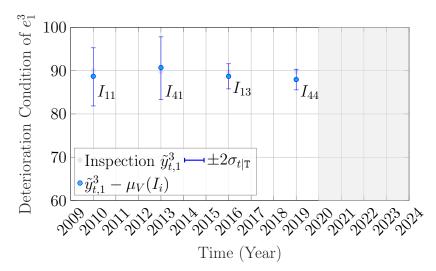
Example of a Beam Structural Element





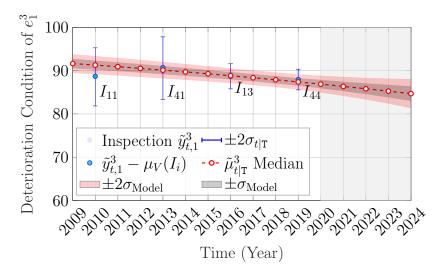
Example of a Beam Structural Element





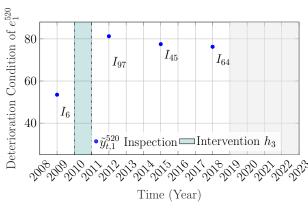
Example of a Beam Structural Element

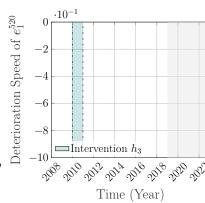




Structural Element Underwent Reparation

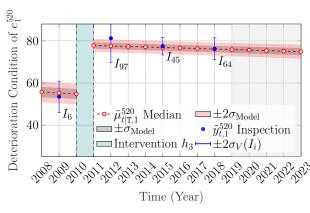


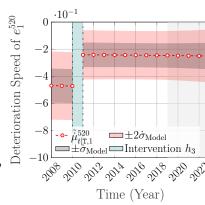


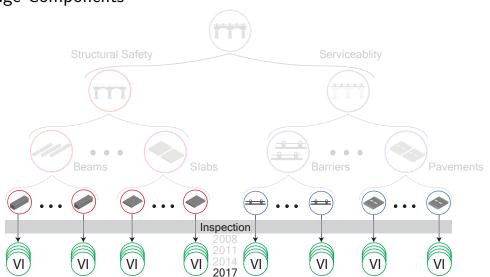


Structural Element Underwent Reparation









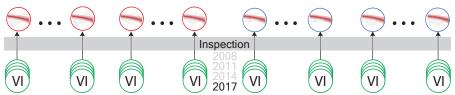
Network-Level Deterioration

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Bridge Components



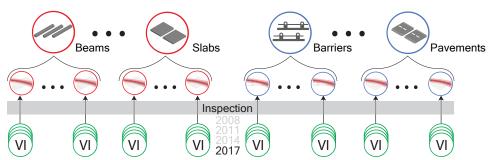
Network-Level Deterioration



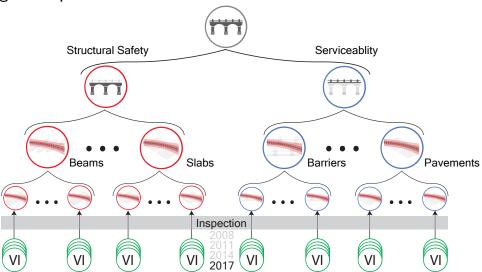
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Network-Level Deterioration

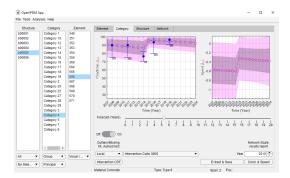


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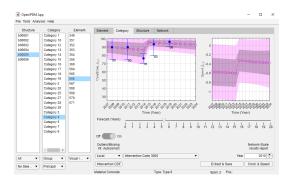


Network-Level Deterioration

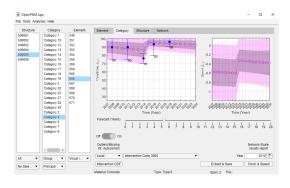
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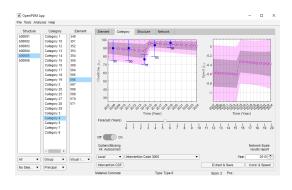




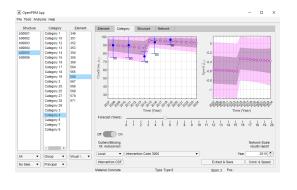
Open-source software developed in MATLAB.



- Open-source software developed in MATLAB.
- Infrastructures Probabilistic Deterioration Modeling.



- Open-source software developed in MATLAB.
- Infrastructures Probabilistic Deterioration Modeling.
- User Interface.



- Open-source software developed in MATLAB.
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The software | OpenIPDM | is available



▶ https://github.com/CivML-PolvMtl/OpenIPDM