



Assessment and prioritizing of combined sewer systems using Bayesian networks

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Presentation outline

1. Motivation:

- Definitions
- Provincial regulation and limitations
- Objectives

2. Risk assessment approaches

3. Results and discussion

4. Conclusion



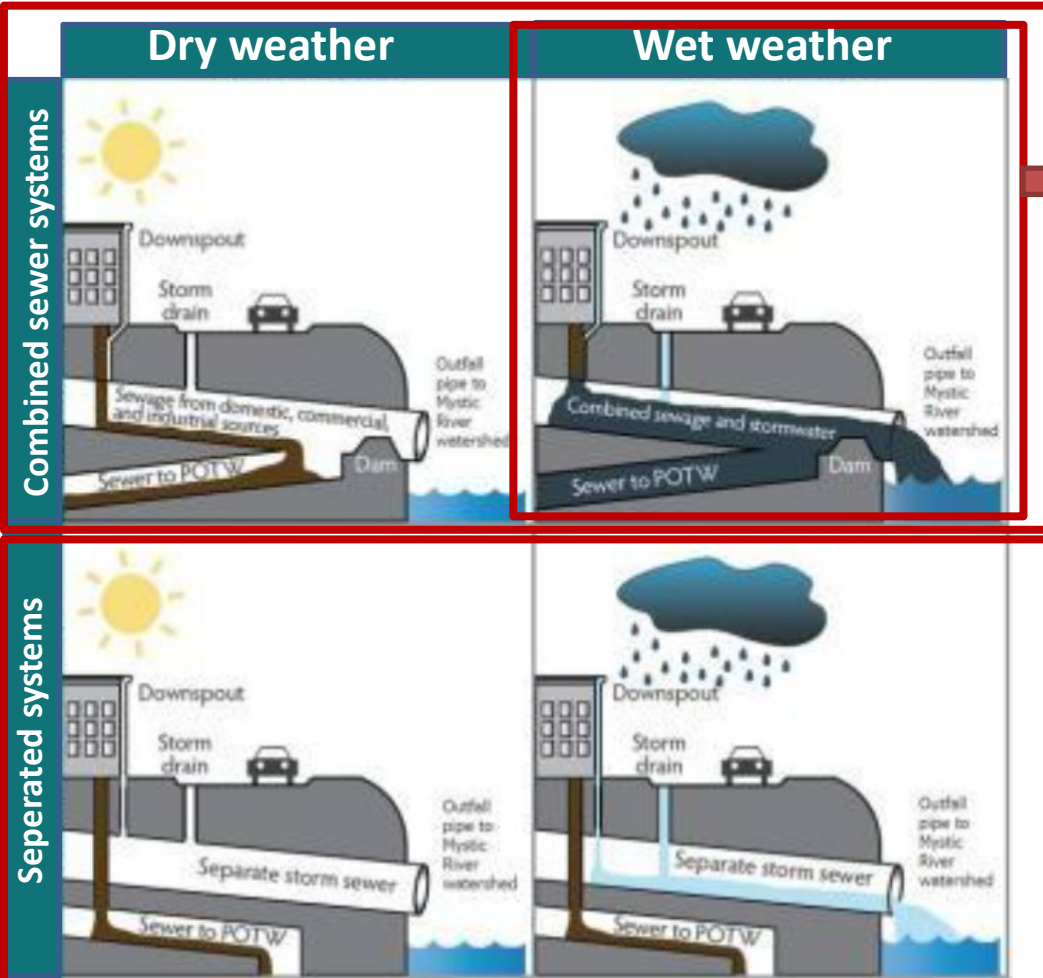
Sewerage system

Motivation

Approach

Results &
Discussion

Conclusion



Combined sewer systems (CSSs)

Combined sewer overflows (CSOs)

- Exceeding the wastewater treatment plant's capacity
- Untreated discharge of a combination of wastewater and urban runoff
- Microbial pathogens, physico-chemical contaminants and emerging contaminants

Separated systems

Source: USEPA

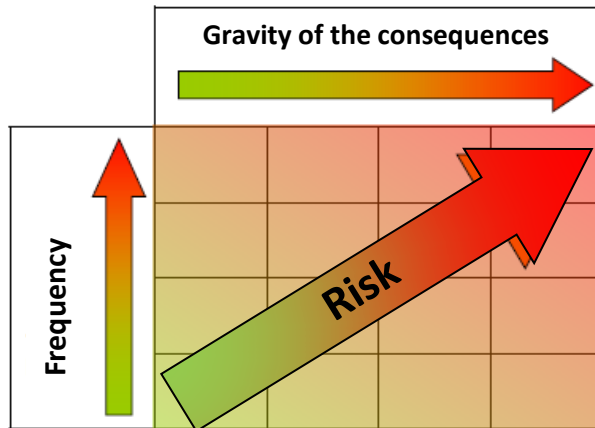


Provincial regulation and limitations

- Approach required by the regulation: **deterministic approach**



Anthropogenic risk assessment



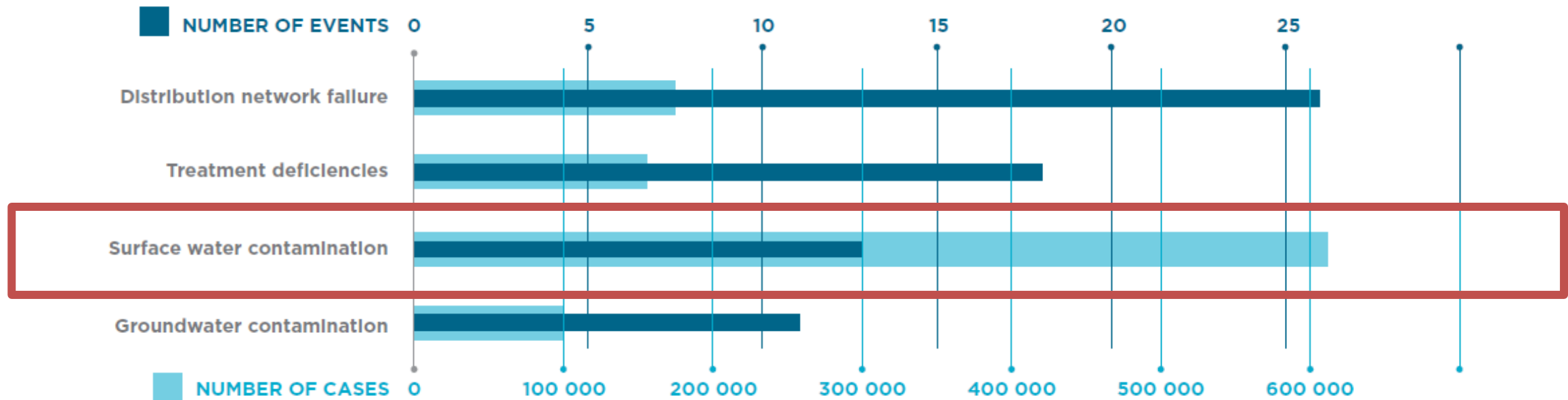
Frequency	Gravity of consequences			
	Minor	Serious	Critical	Catastrophic
Very frequent (≥ 1 time/ week)	Medium	High	Very high	Very high
Frequent (≥ 1 time/ year)	Low	Medium	High	Very high
Occasional (> 1 time/ 5 years)	Very low	Low	Medium	Very high
Rare (≤ 1 time/ 5 years)	Very low	Very low	Low	High

**Water
withdrawal
and
protection
Regulation**



Frequency VS Risk level

Contamination of water sources: intrusion of animal faeces due to heavy rain and discharges of wastewater.



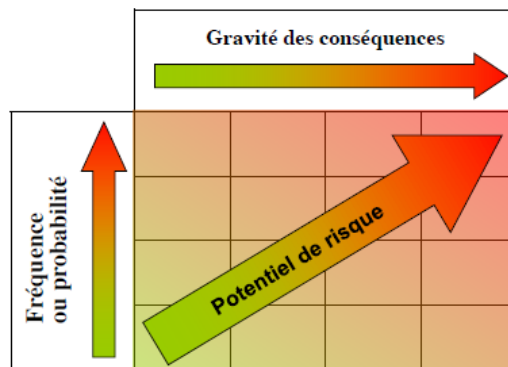
The number of events of waterborne disease outbreaks and the number of cases of illness among consumers in Europe, North America and New Zealand, 2000–2014



Regulation VS Research

Regulation

**Deterministic method:
Risk matrix**



(Prévost et al., 2017; Prévost et al., 2011)

Research

- **Targeted water sampling and laboratory analysis**
(Al Aukidy and Verlicchi, 2017; Calderon et al., 2017; Madoux-Humery et al., 2015; Passerat et al., 2011)
- **Real-time measurement of biochemical indicator of fecal pollution using ColiMinder**
(Burnet et al., 2021; Sylvestre et al., 2021)
- **Quantitative Microbial Risk Assessment (QMRA) with Monte Carlo simulations**
(Sylvestre et al., 2020; Taghipour et al., 2019)
- **Contaminant transport modeling**
(Taghipour et al., 2019)



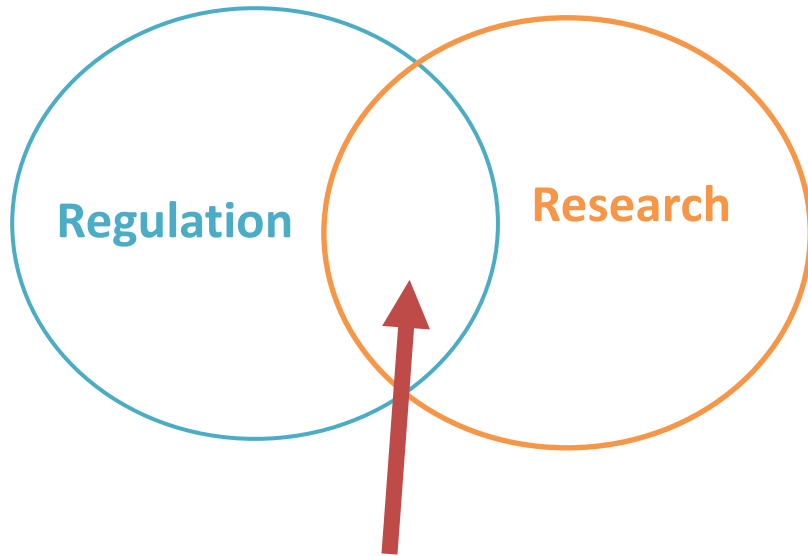
Objective

Motivation

Approach

Results &
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Conclusion



The purpose of this research is to bridge the gap between the regulatory oversight and the research fields to establish a method for assessing the risk posed by CSOs upstream drinking water intakes (DWIs)

Specific criteria

- Approach must be **easily applicable** in practice by managers of drinking water treatment plants
- Use **only data available** in provincial and federal databases
- Provide a **range of potential risk level** outcomes linked to **uncertainty and variability** rather than providing a single risk level estimated for a single hazard scenario



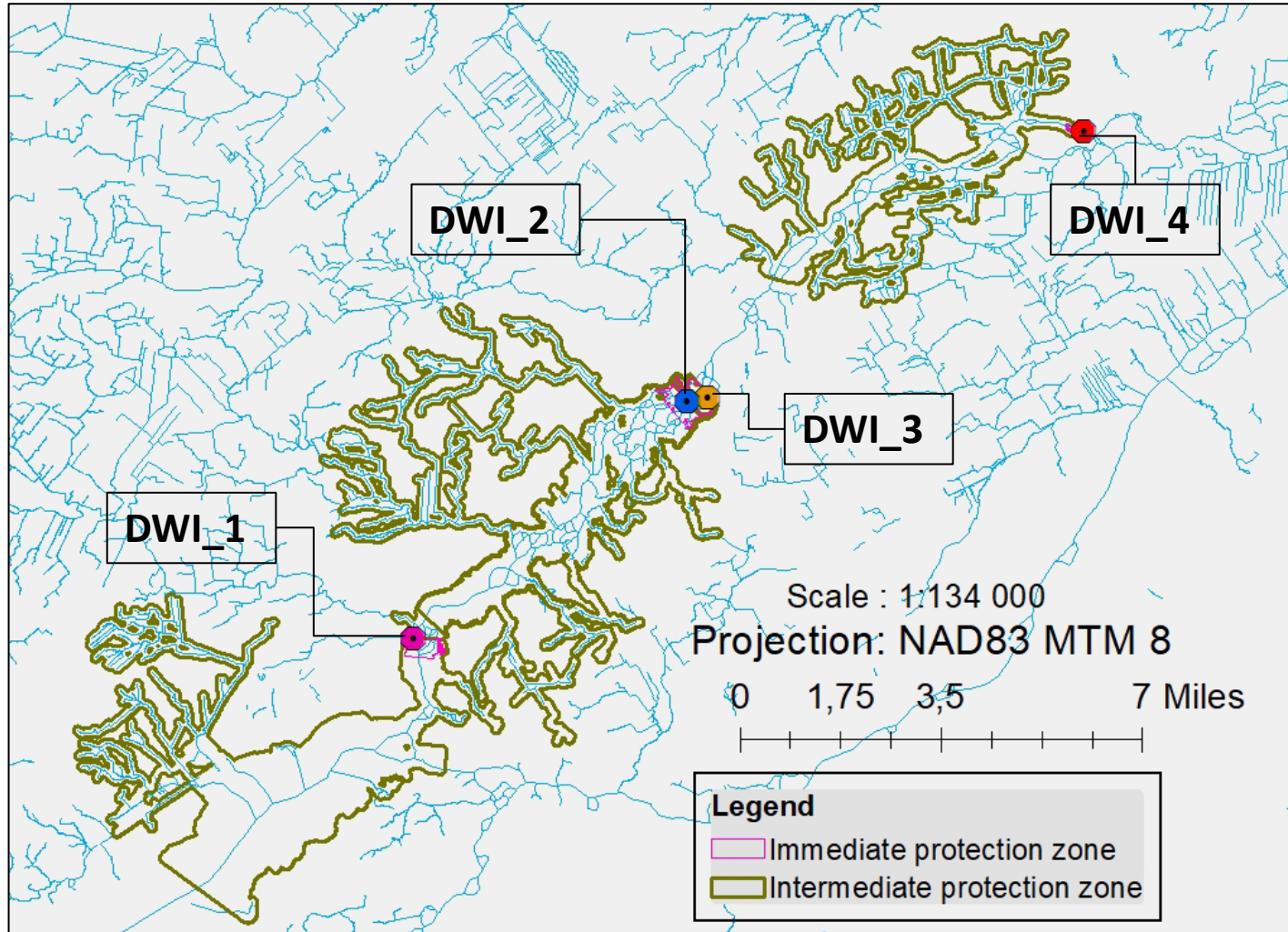
Study site

Motivation

Approach

Results &
Discussion

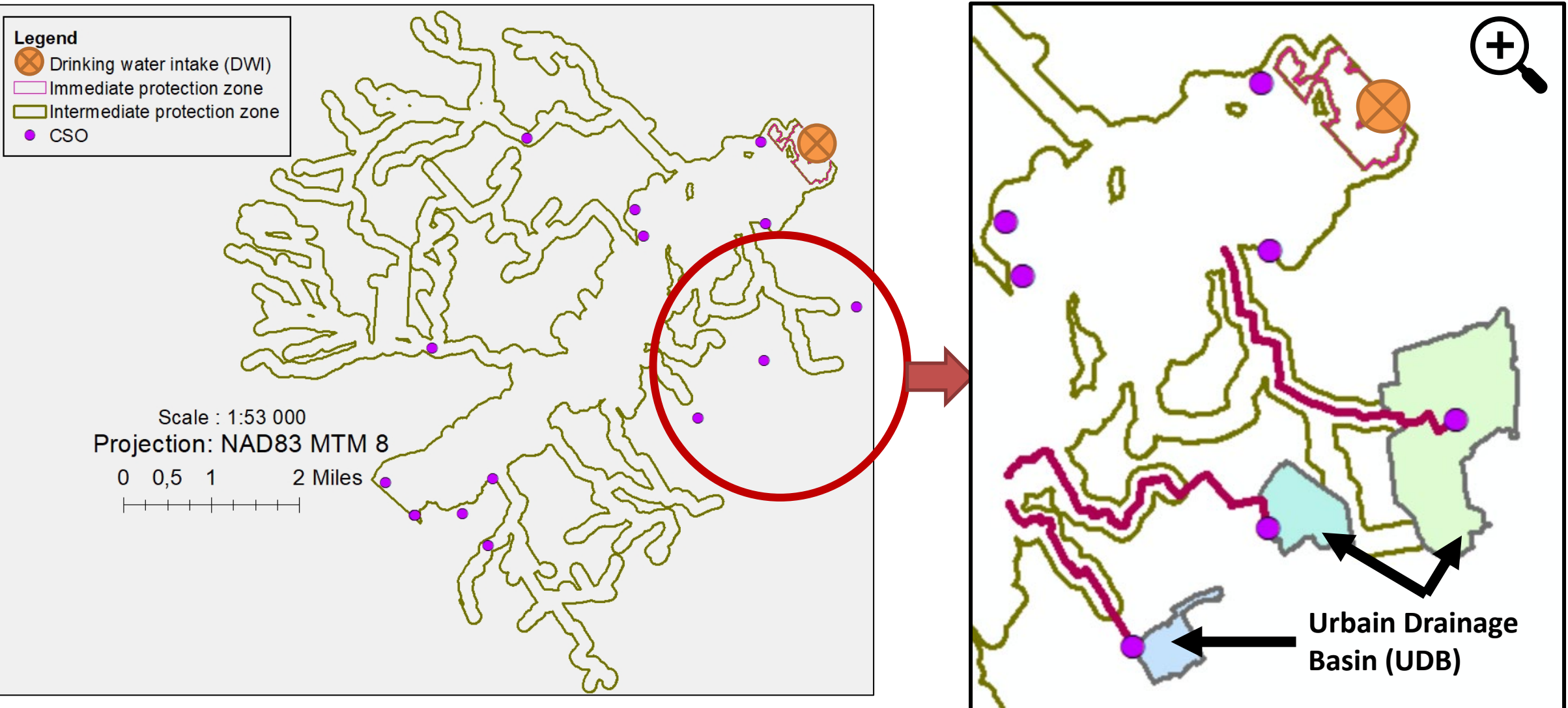
Conclusion



- Highly urbanized source water
- Four drinking water intakes (DWIs) located in southern Quebec
- Inventory of CSOs in the immediate and intermediate protection zones
- Total of 89 CSO outfalls



Urban Drainage Basin (UDB)





Deterministic approach



$$DEU - 1 = D^2 \times \text{MAX} \sum_{i=1}^n \text{Overflow duration} \times \text{Pop UDB}$$

$$DEU - 2 = \frac{DEU - 1}{\ln(\text{dist riv})}$$

$$DEU - 1F = D^2 \times \text{MAX} \sum_{i=1}^n \text{Number of overflow} \times \text{Pop UDB}$$

$$DEU - 2F = \frac{DEU - 1F}{\ln(\text{dist riv})}$$

Hazard

Risk

Exposure



Deterministic approach

Motivation

Approach

Results &
Discussion

Conclusion



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Montréal

Risk level	Very low	Low	Medium	High	Very high
DEU-2	<5	5-2 700	2 701-46 000	46 001- 475 000	> 475 000
DEU-2F	<5	5-235	236-2 400	2 401-25 000	> 25 000

(McQuaid et al., 2019)



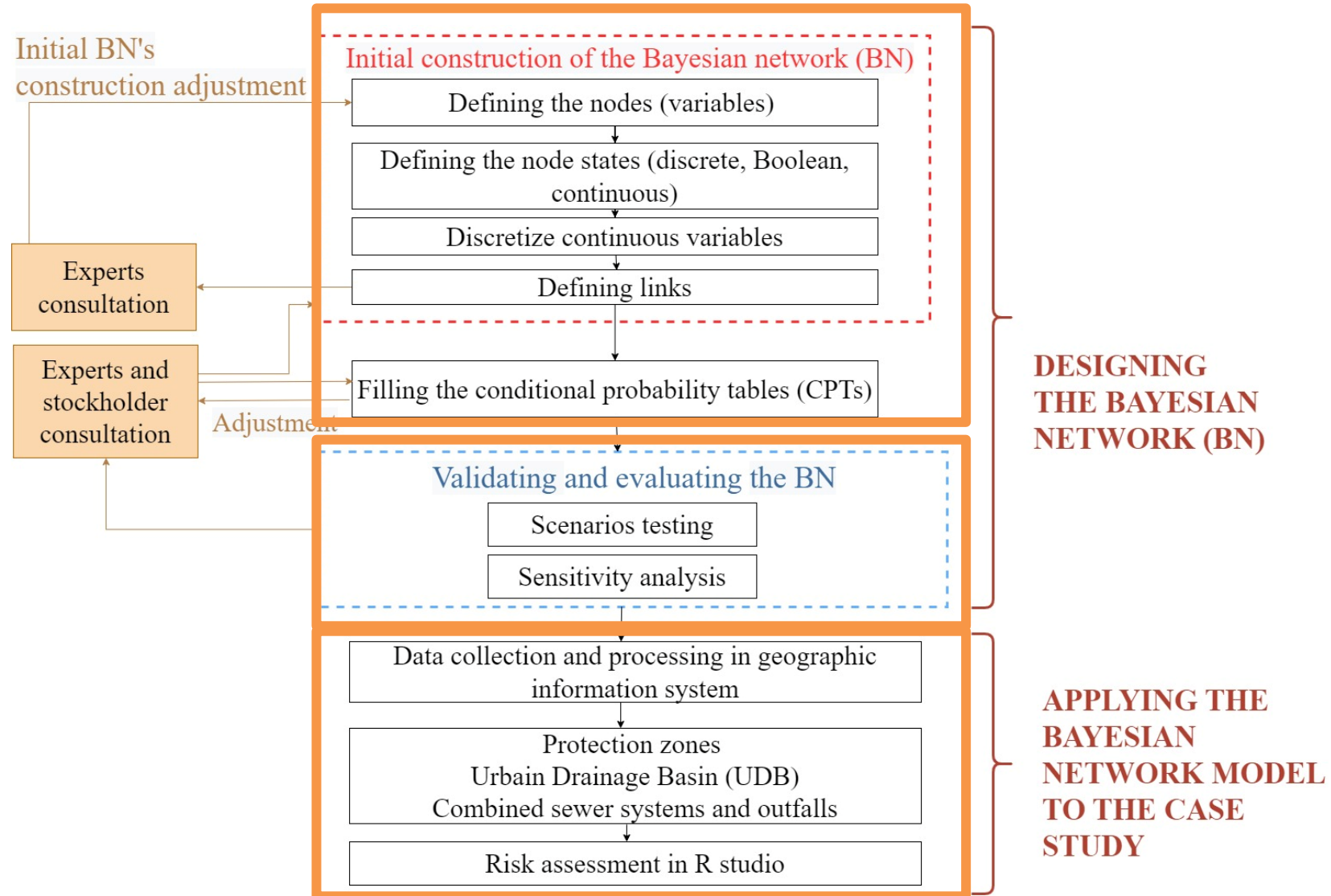
Probabilistic approach

Motivation

Approach

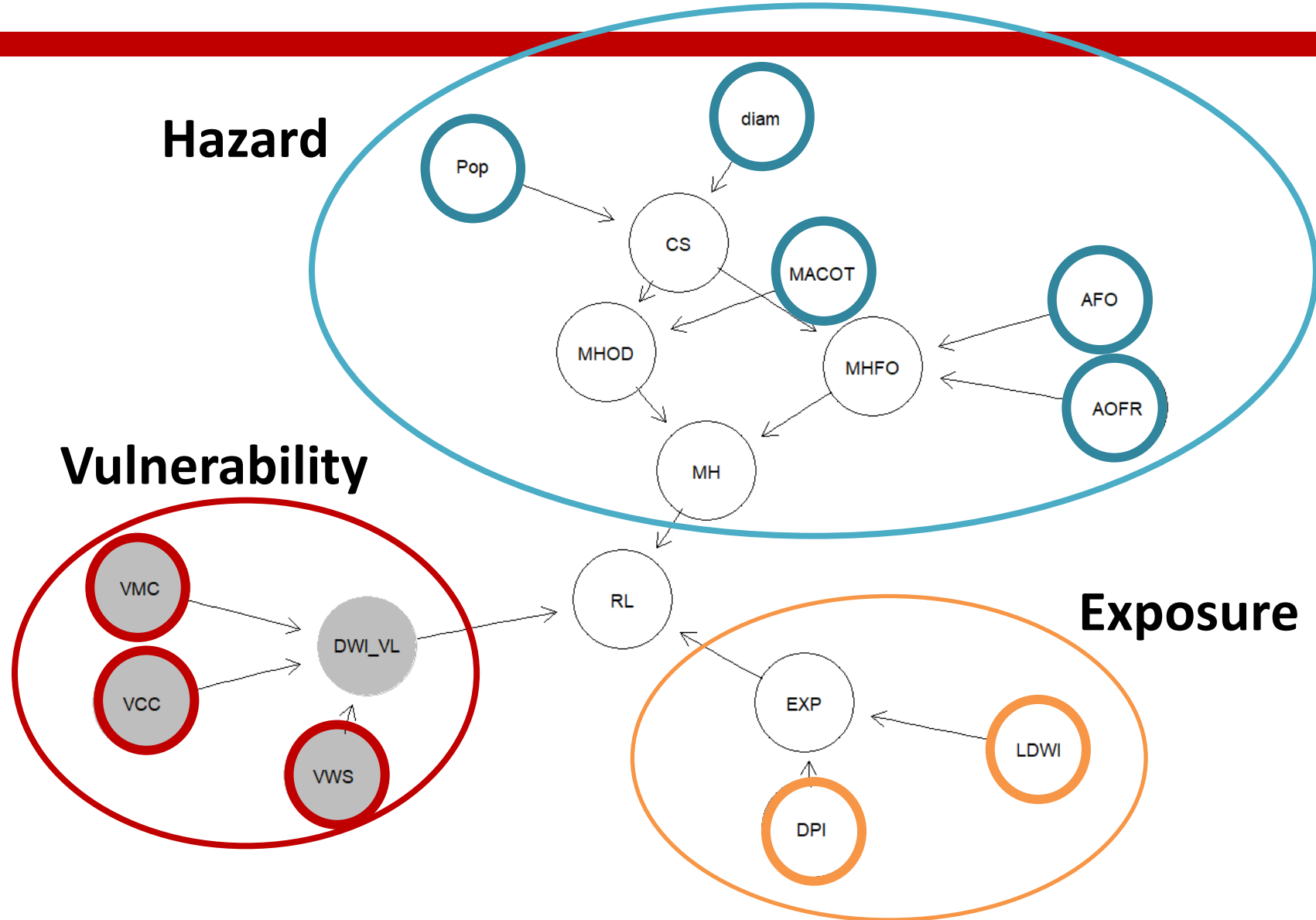
Results &
Discussion

Conclusion





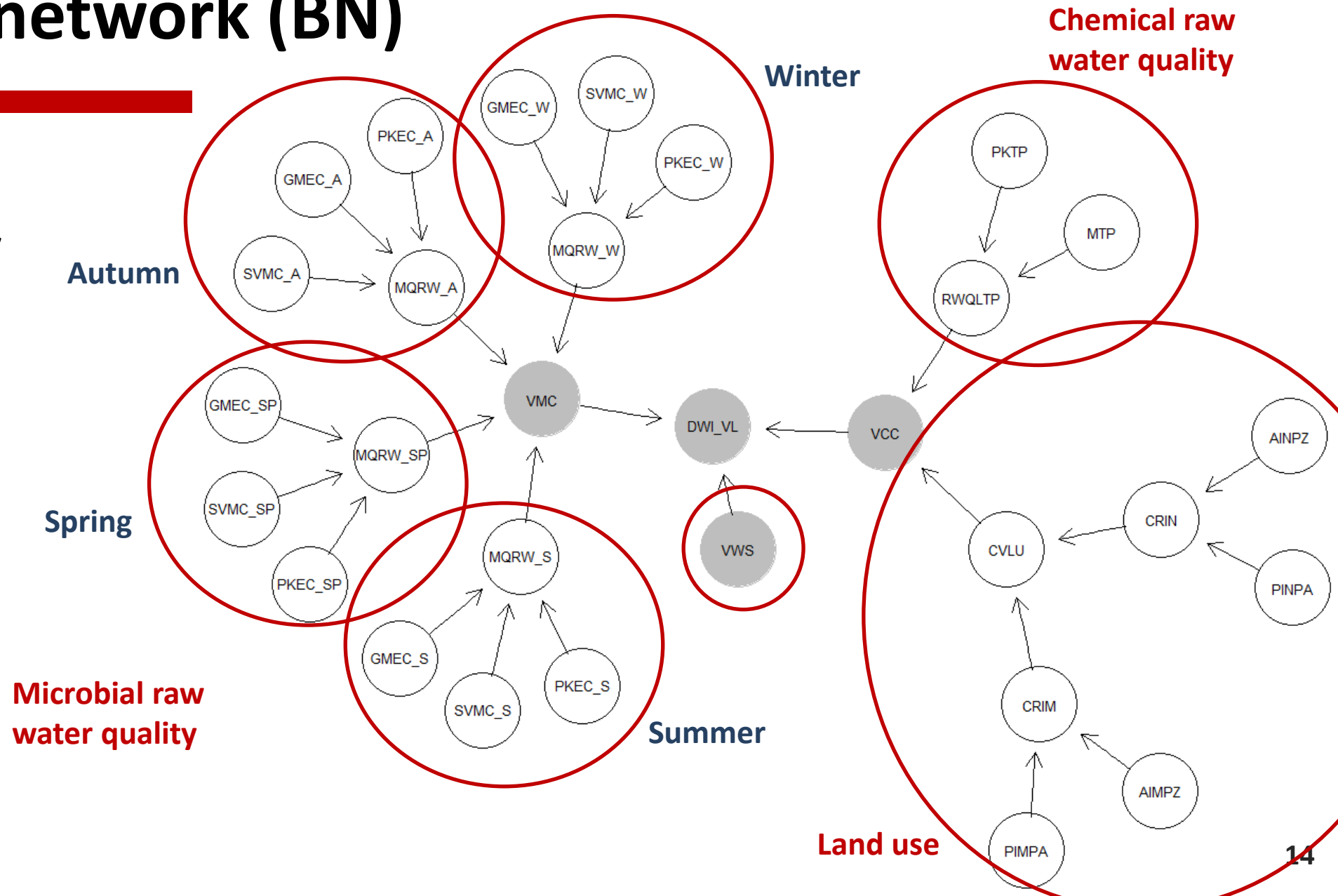
Bayesian network (BN)





Bayesian network (BN)

Drinking water
intake vulnerability
level (DWI_VL)



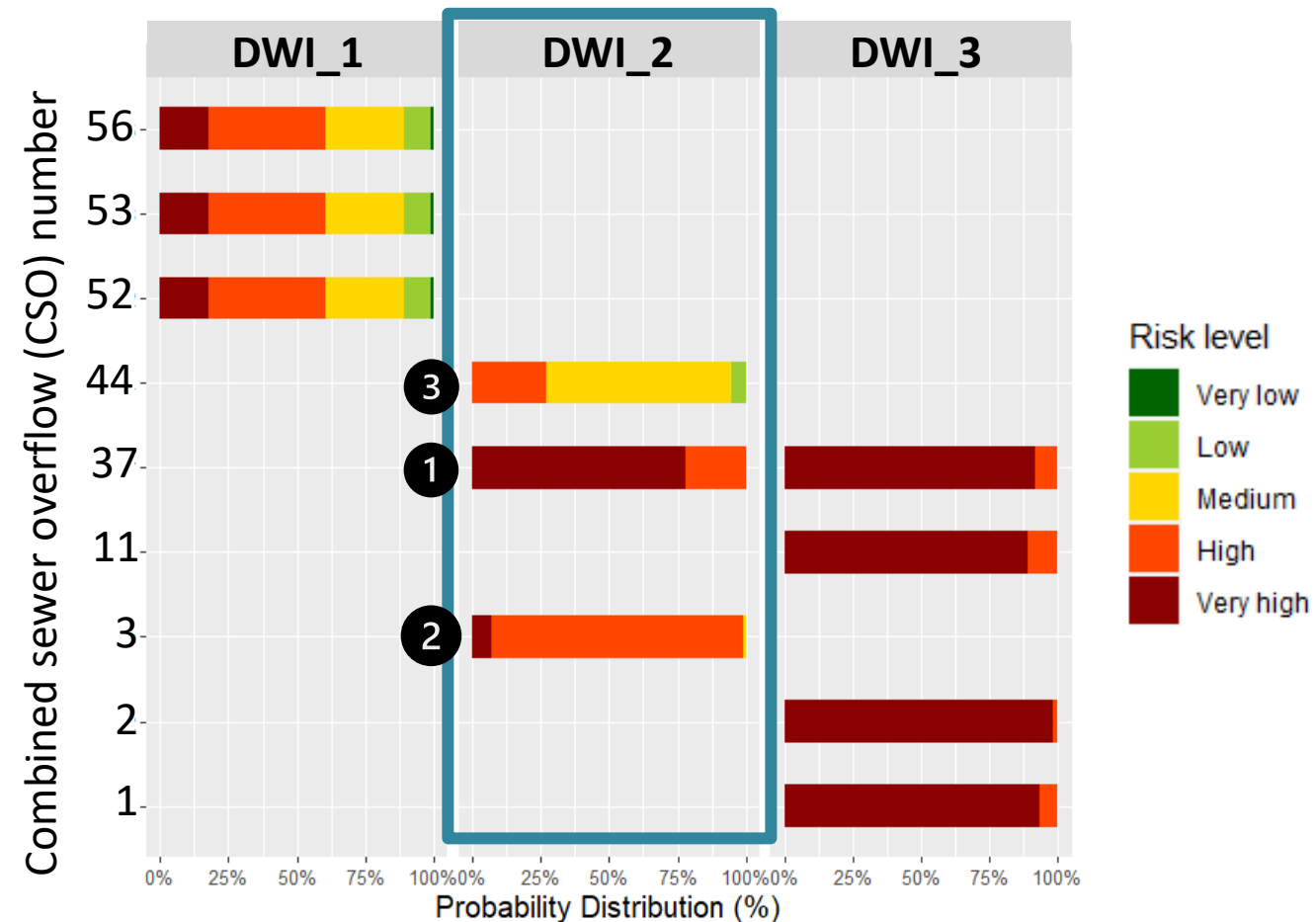


Results and discussion

Deterministic approach

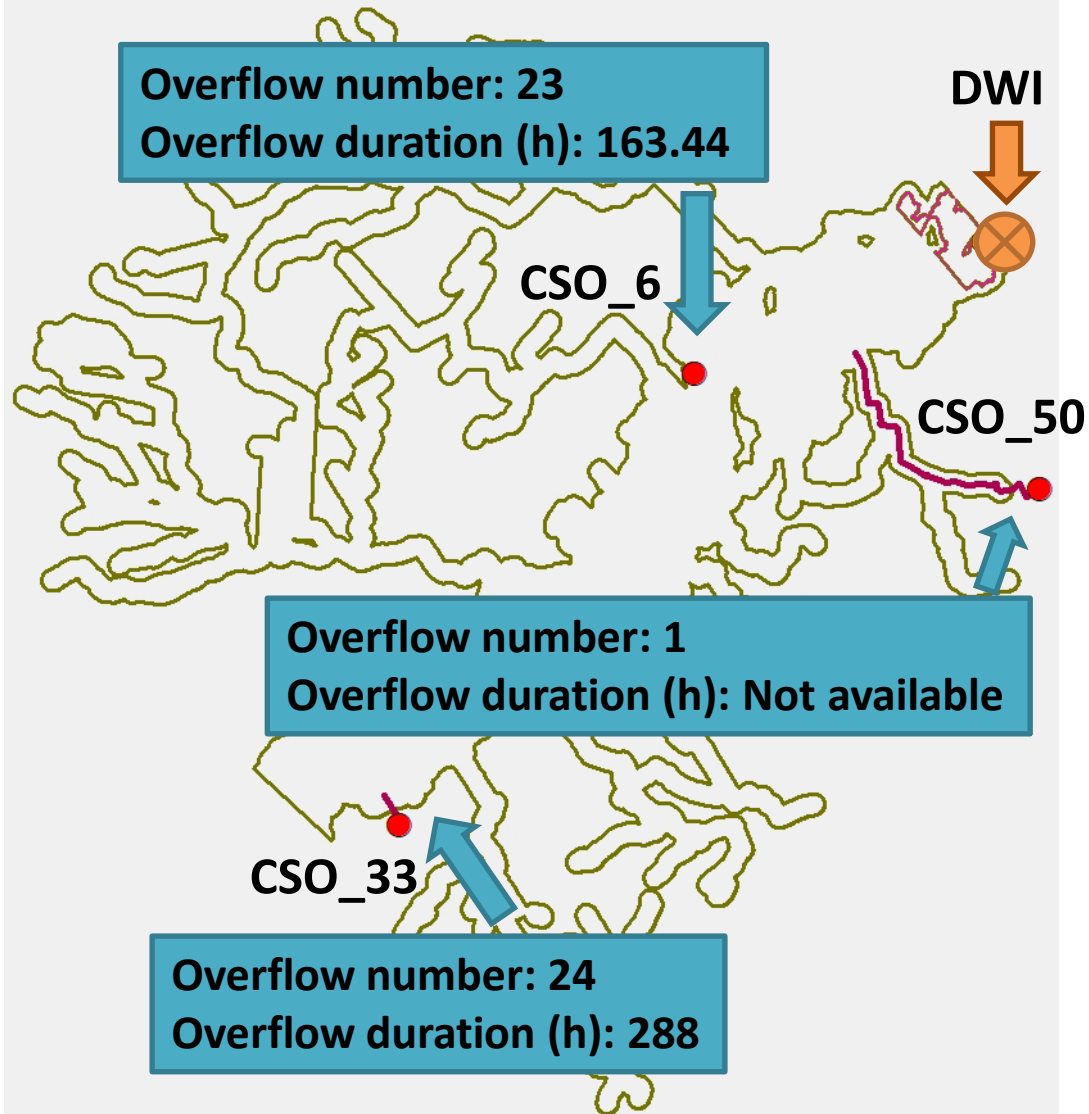
CSO	DWI downstream	Risk level
CSO_56	DWI_1	Very high
CSO_53	DWI_1	
CSO_52	DWI_1	
CSO_44	DWI_2	
CSO_37	DWI_2	
	DWI_3	
CSO_11	DWI_3	
CSO_3	DWI_2	
CSO_2	DWI_3	
CSO_1	DWI_3	

Probabilistic approach





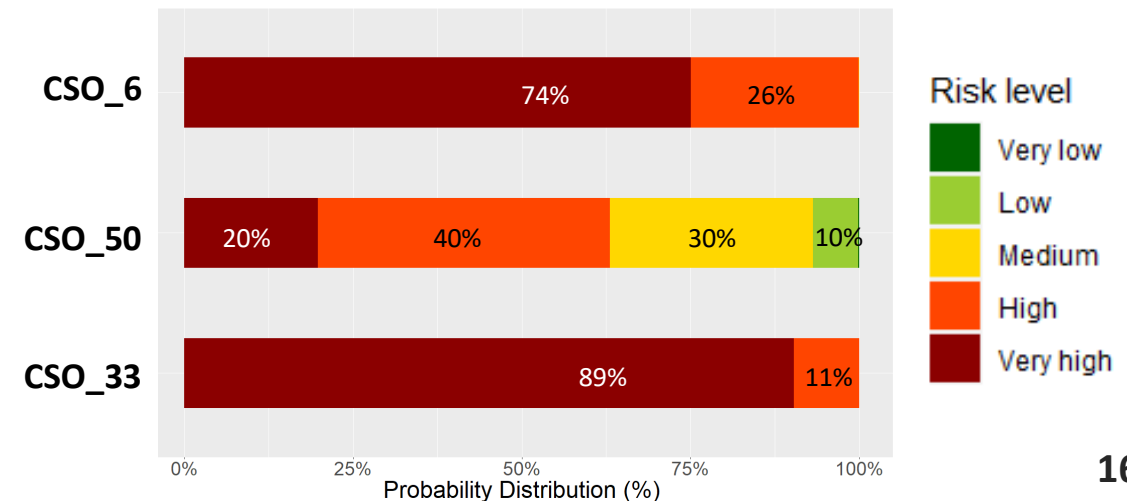
Probabilistic VS Deterministic



Deterministic approach

CSO	Risk level
CSO_6	High
CSO_50	
CSO_33	

Probabilistic approach





Lack of data

Motivation

Approach

Results &
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40 CSOs couldn't be assessed using the deterministic approach

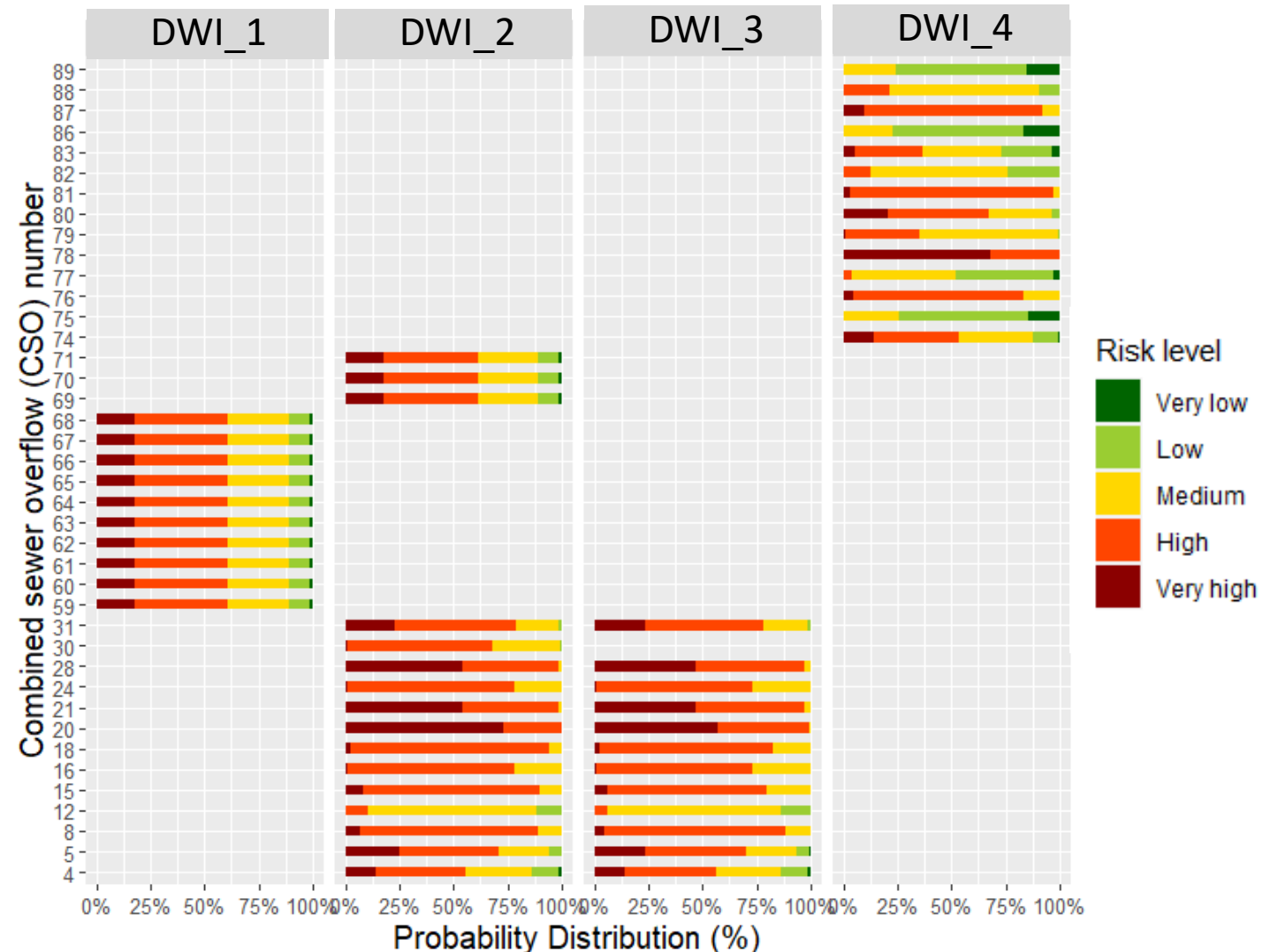


Lack of data such as :

- Diameter of the pipe
- Delineation of UDB
- Duration and frequency of overflows

Annual frequency of overflows

AFO		CSO	
0 to 1	█	0.200	
1 to 2	█	0.200	
2 to 5	█	0.200	
5 to 14	█	0.200	
>=14	█	0.200	





Conclusion

- Deterministic approach **cannot reflect all possible scenarios** in the final outcome;
- Deterministic approach has **limitations** for **risk prioritization** in a densely urbanized watershed
- The deterministic approach could lead to a **misplaced risk management decision**, as it only considers the impact of a **single risk scenario**
- The Bayesian network (BN) is a valuable tool for conducting a probabilistic approach **under uncertainty** and integrating **different types of knowledge**
- The findings also show that this probabilistic model can handle an **incomplete input dataset**
- Probabilistic outcomes can be used to assist stakeholders in **designing more efficient sampling campaigns** for quantifying microbiological contaminants, in particular CSSs.



Acknowledgements

- Partner municipalities

- Watershed organization



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- NSERC PURE CREATE



Thank you and Questions ?



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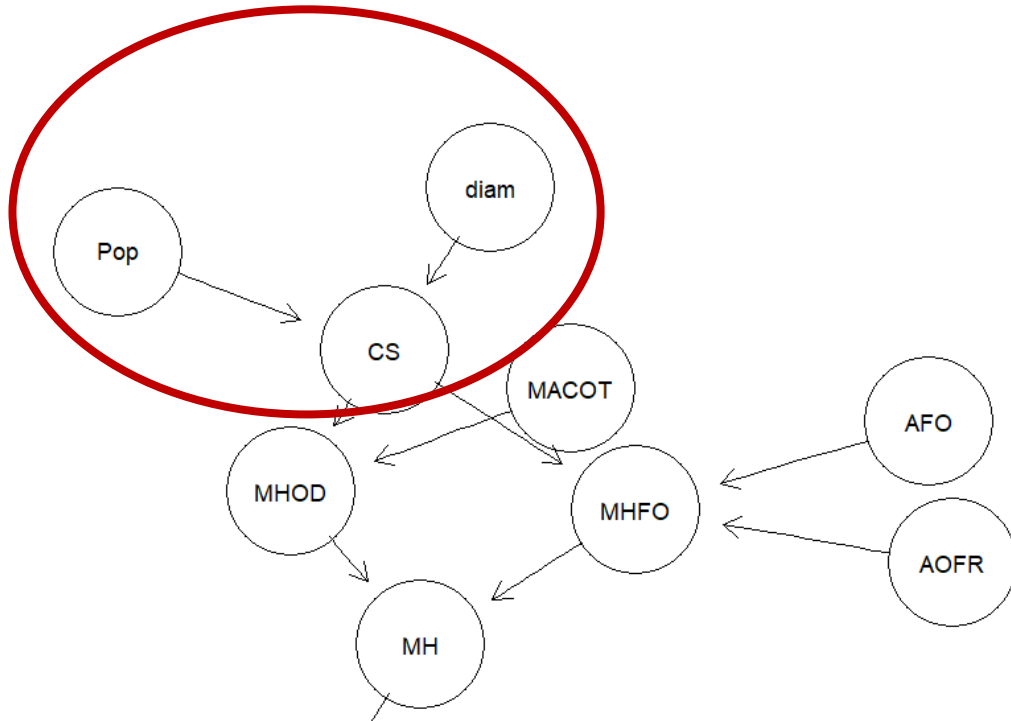
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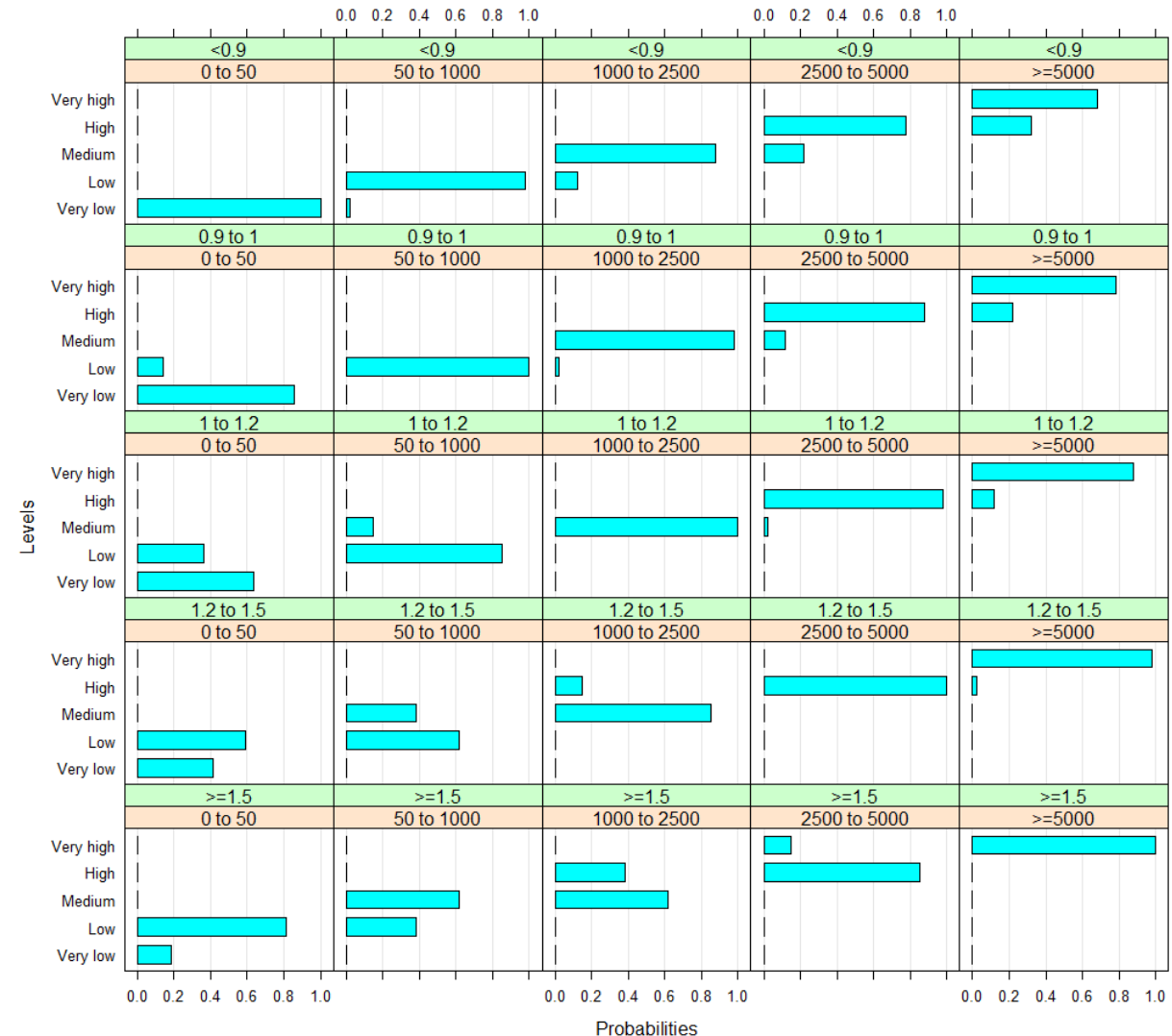
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Conditional probability distribution (CPD)

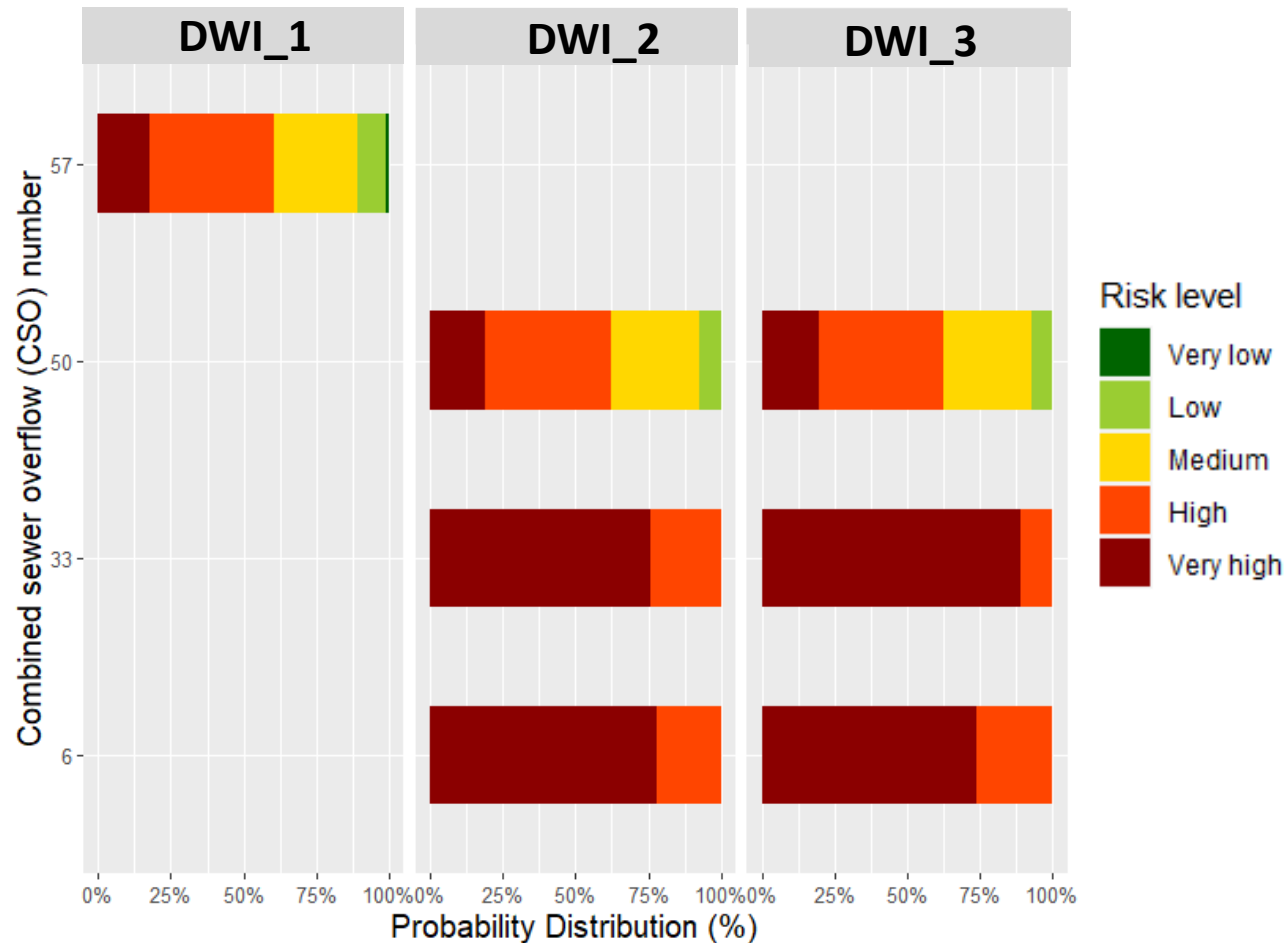


Conditional probability distribution for node
'consequence severity'

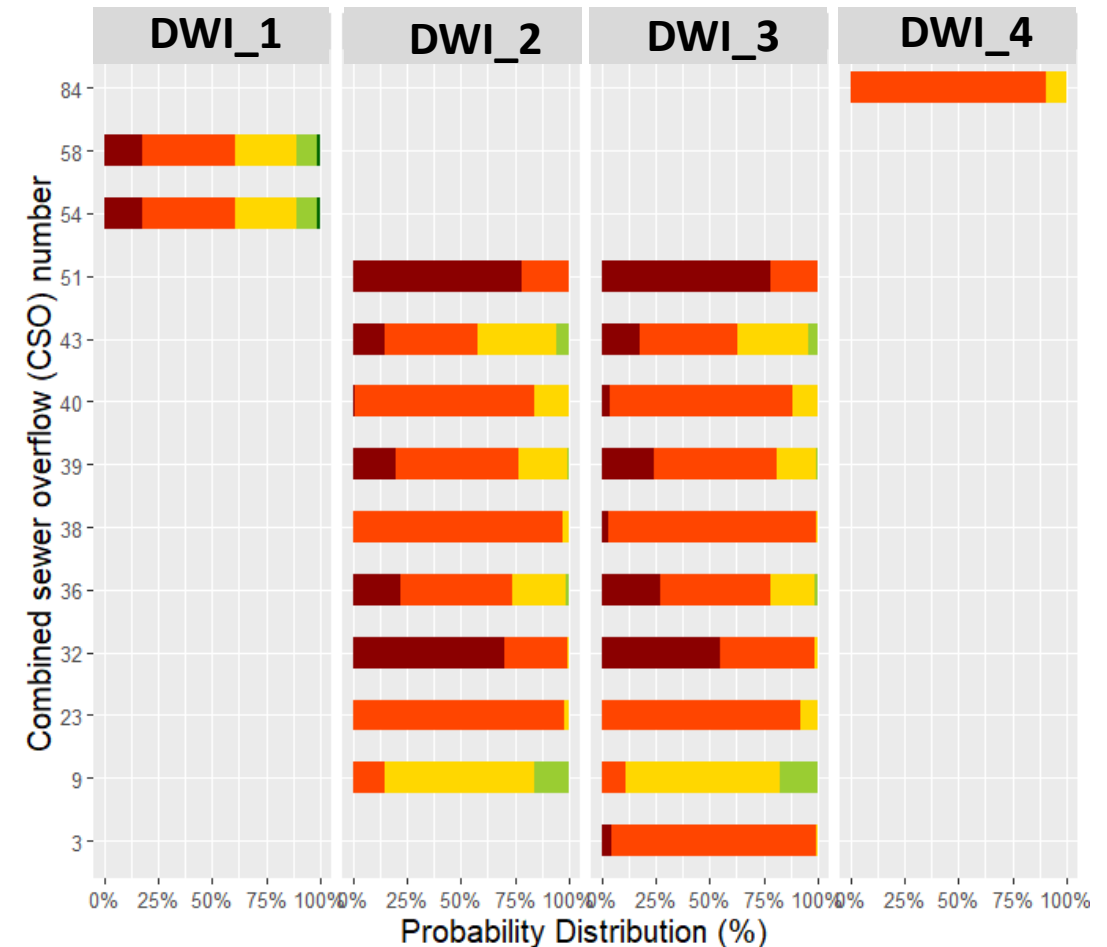




Results and discussion



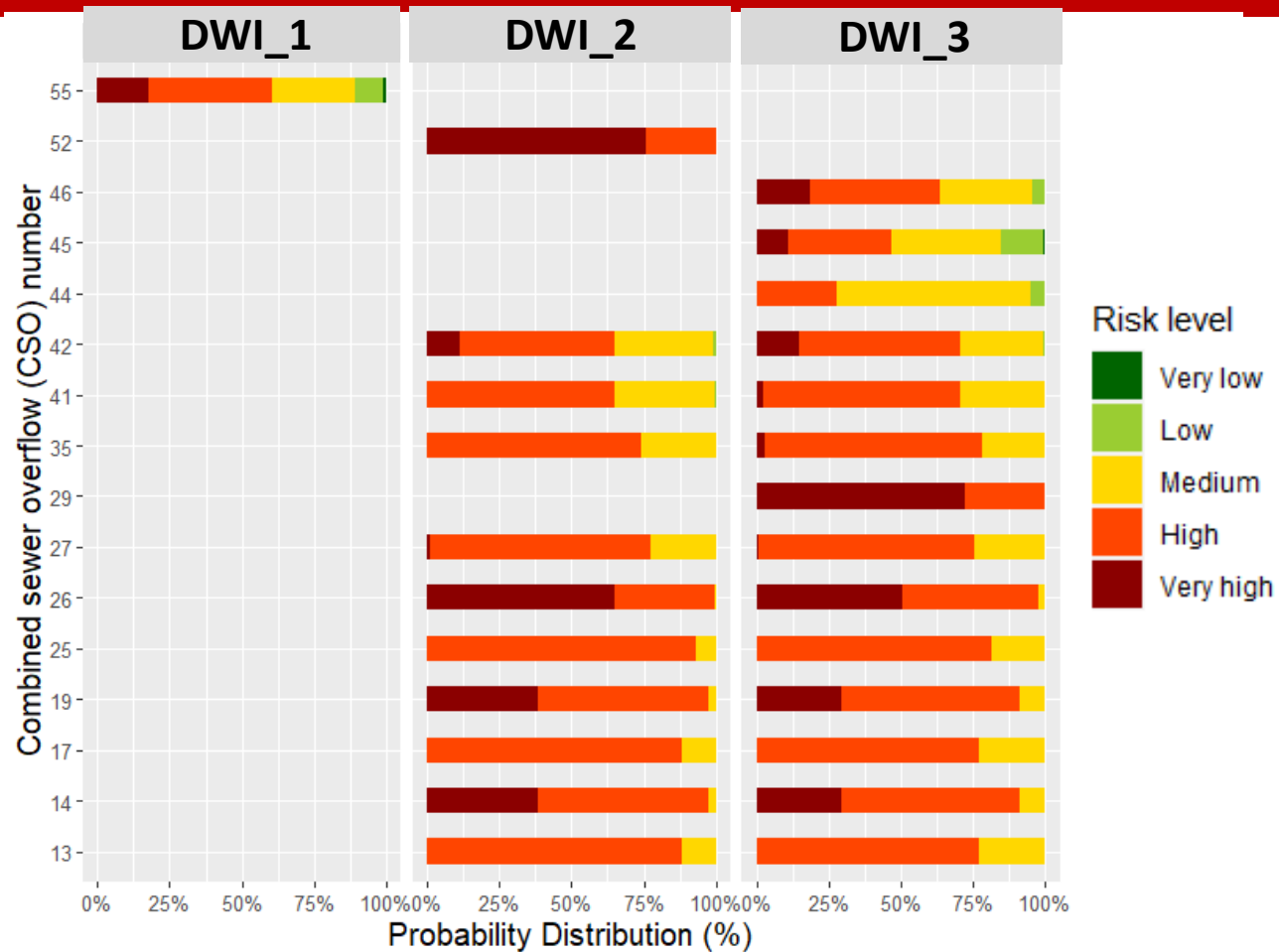
Probabilistic risk of CSO associated with **high** risk using deterministic approach.



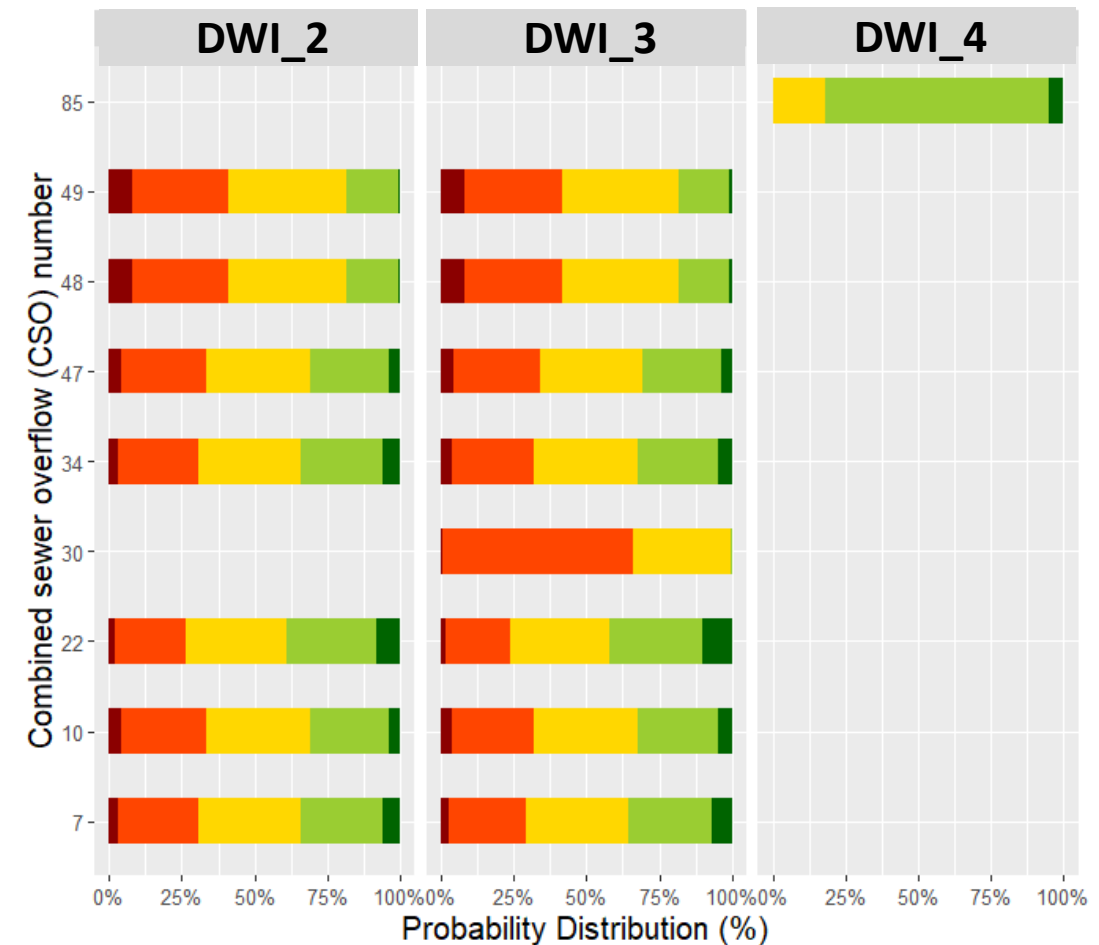
Probabilistic risk of CSOs associated with **medium** risk using deterministic approach.



Results and discussion



Probabilistic risk of CSOs associated with low risk using deterministic approach.



Probabilistic risk of CSOs associated with very low risk using deterministic approach.