

Probabilistic Forecasting For Urban Water Management



An Urban Case Study: Aarhus, Denmark

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$$P(S \leq x | \hat{S} = 0) = P(S \leq x | S > 0, \hat{S} = 0)P(S > 0 | \hat{S} = 0) + P(S = 0 | \hat{S} = 0)$$

$$\hat{P}(S = 0 | \hat{S} = x^*) = a \exp(bx^*) + c$$

$$P(S \leq x | \hat{S} = x^*) = P(S \leq x | S > 0, \hat{S} = x^*)P(S > 0 | \hat{S} = x^*) + P(S = 0 | \hat{S} = x^*)$$

$$P(S < x, \hat{S} \leq x^* | S > 0, \hat{S} > 0)$$

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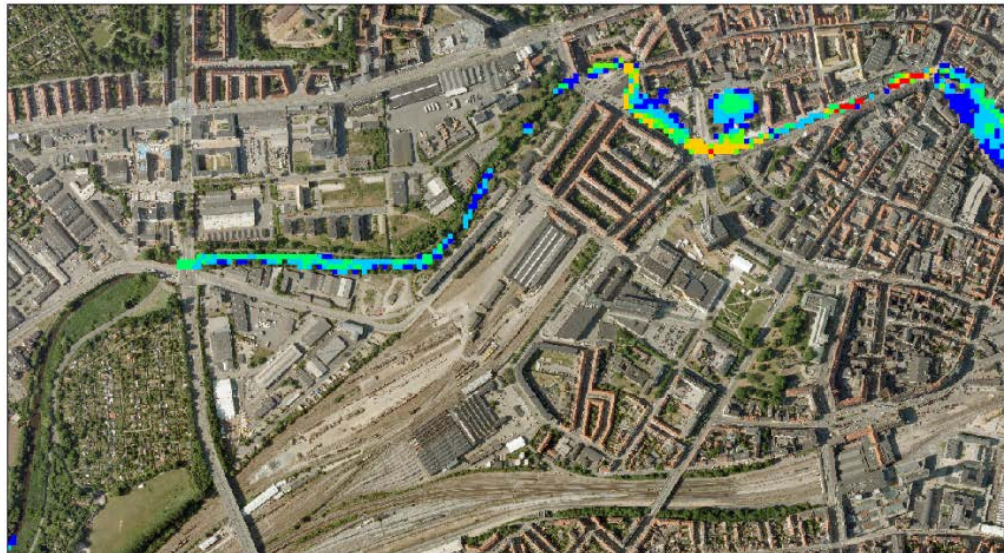
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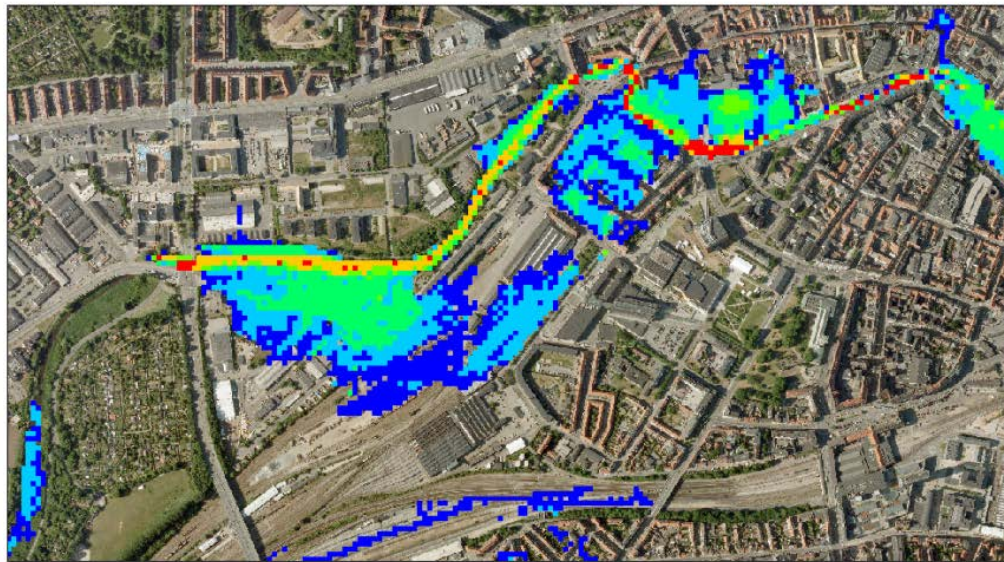
$$P(S = 0 | \hat{S} = x^*)$$





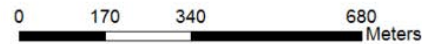
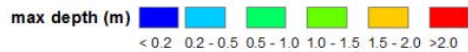
What we'll cover?

▶ 50th percentile



▶ 95th percentile

Legend



Background

OCTOBER 20, 2010

Is Heavy Flooding In St. Lucia A Glimpse Into The Future Of The Caribbean?



What have we done?

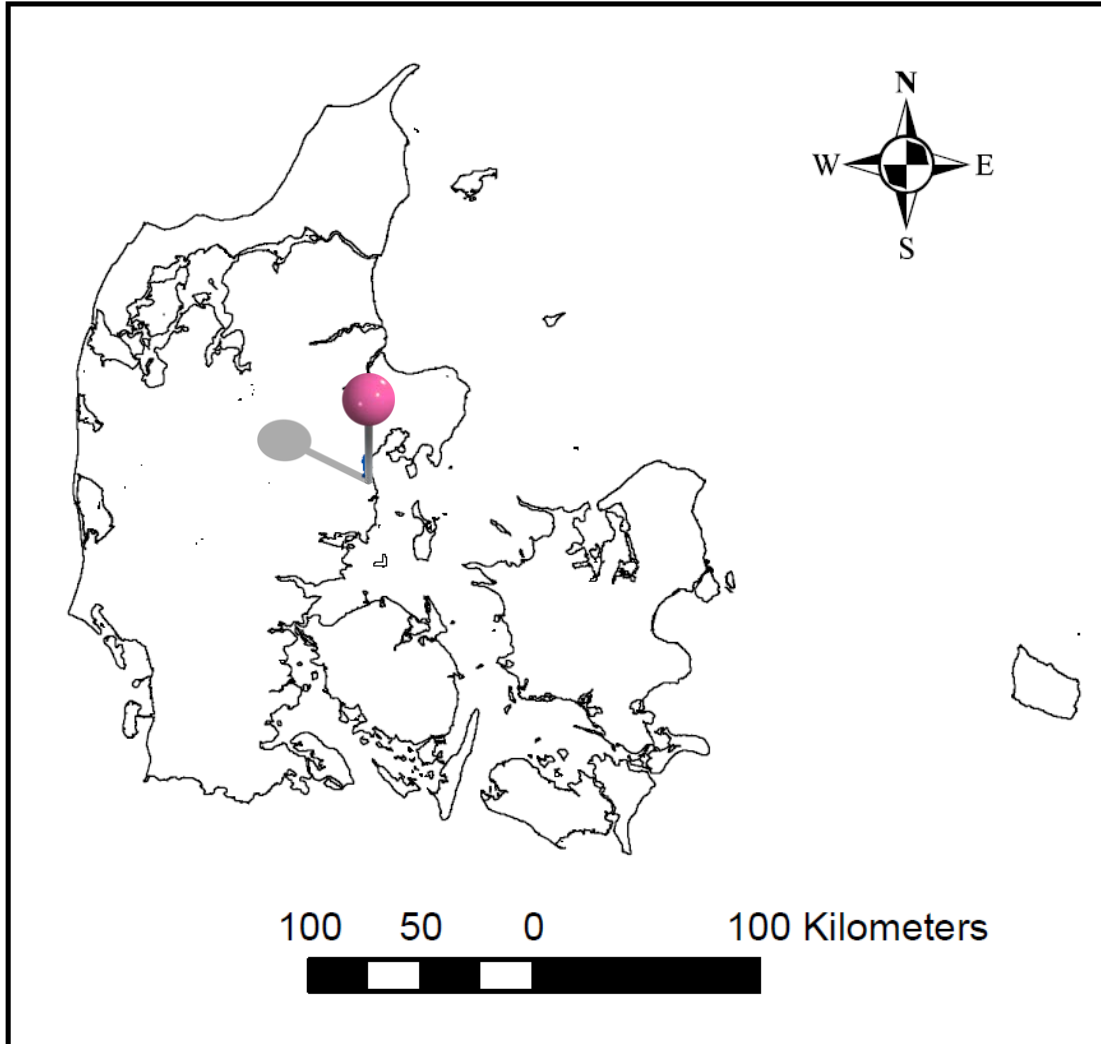
- ▶ Developed a method for estimating the uncertainty in the rainfall forecast
 - ▶ Compared rainfall forecast from NWP model with observed rainfall from rain gauges
 - ▶ Compared two approaches for quantifying the uncertainty in the rainfall forecast
 - ▶ Use the probabilistic information as input to a hydrological hydraulic model



What assumptions have we made?

- ▶ Observed rainfall is the 'real' rainfall
- ▶ Sewer model is fit for the purpose
- ▶ Complete temporal dependence between lead – times
 - ▶ Hence comparison of LHS results to the quantile approach

Case Study-Aarhus Denmark



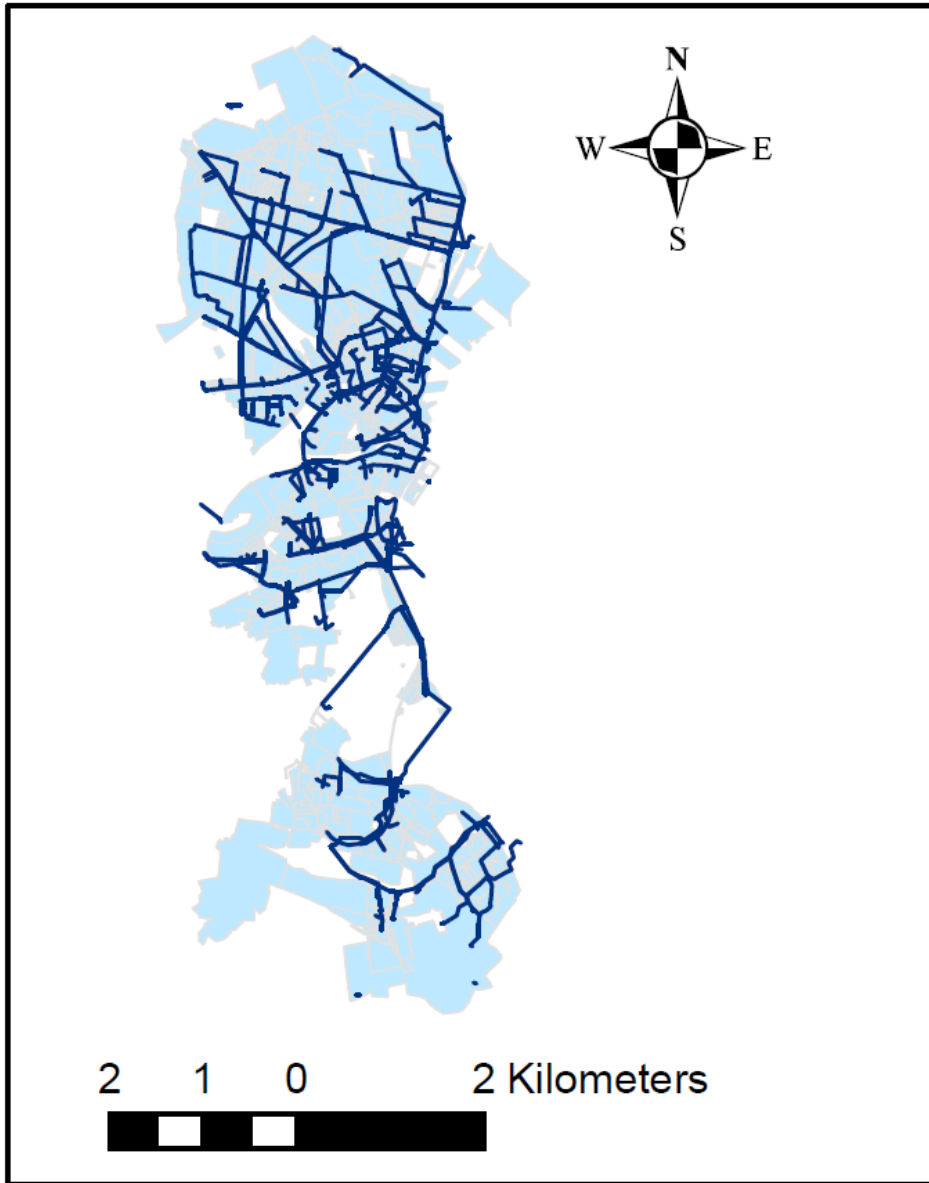
Population – 250,000

High quality data for the sewer system

Archived rainfall forecasts

Long records of observed data

Good rain gauge coverage



Model Case Study

1926 manholes

1657 pipes

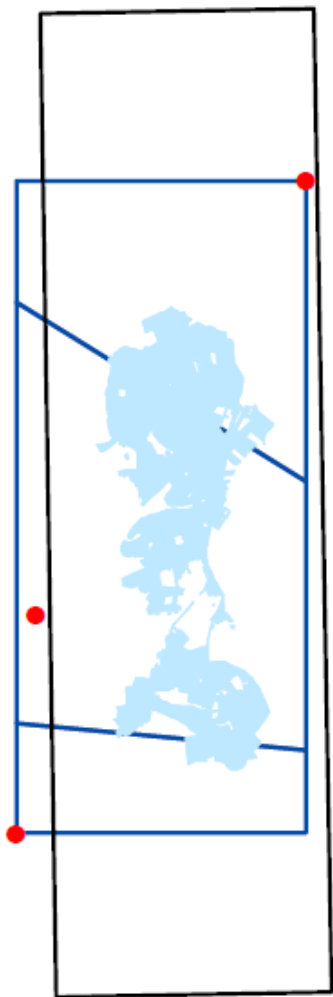
196 weirs

83 basins

26 pumps

.....

Complex network



Legend

- rain_gauges
- Model area
- Forecast coverage
- Thiessen polygon



Data Set

Rain gauge network

3 rain gauges

Volumetric resolution =
0.2mm

Temporal resolution =
1 minute

Duration = 10 years of
data

NWP model data

Grid resolution =
(6.2x11.1)km

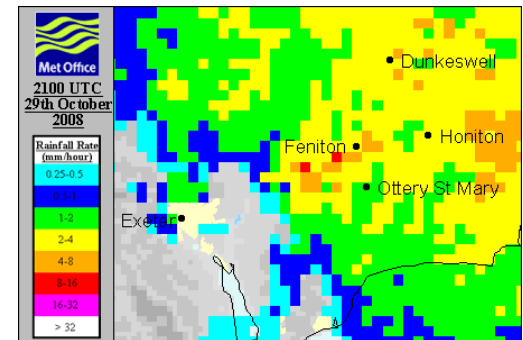
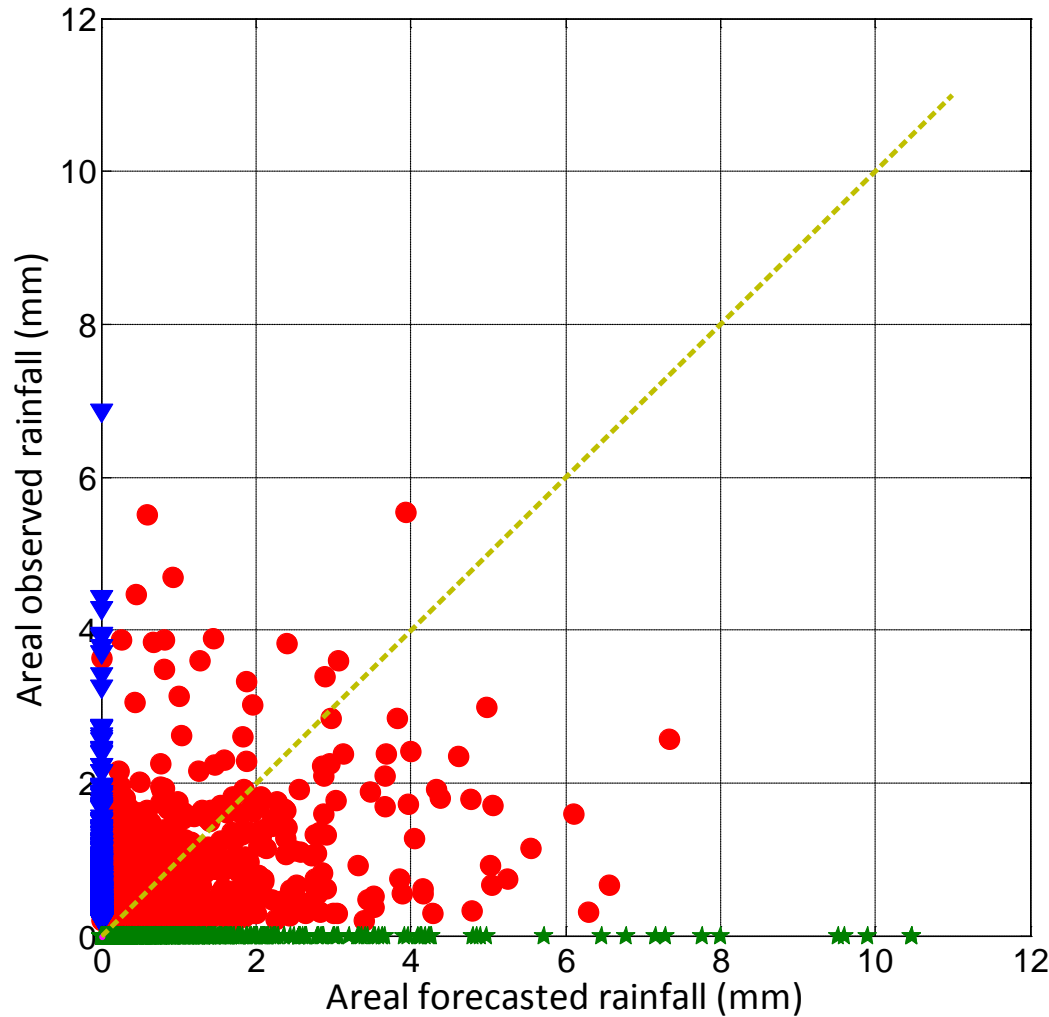
Study area = 138km²

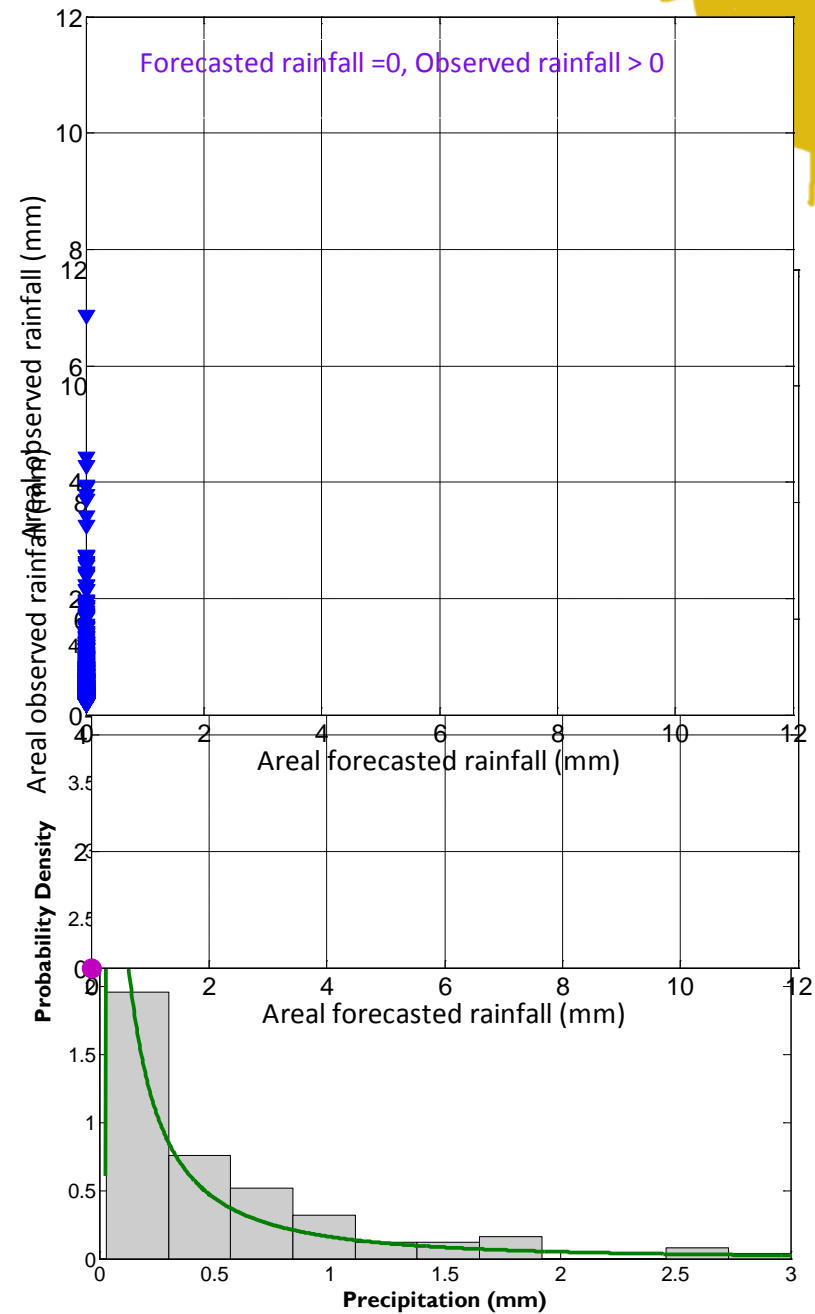
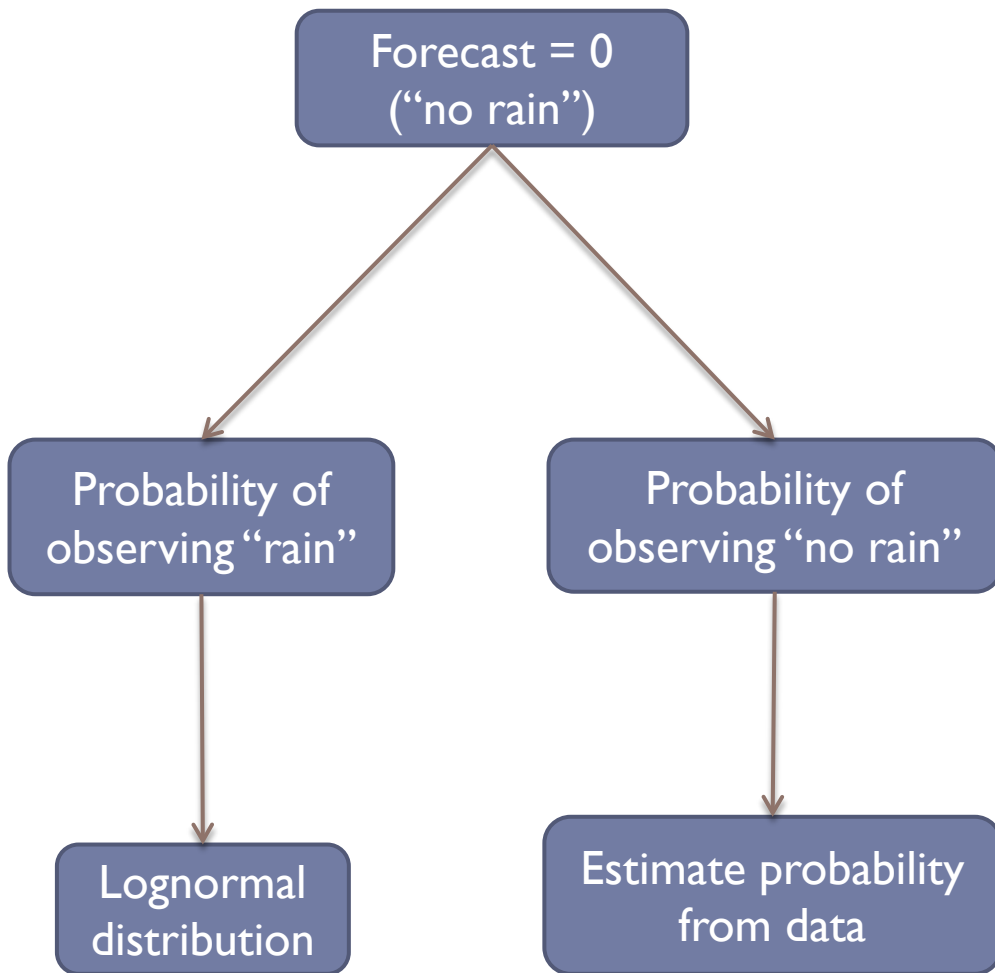
Temporal resolution =
1 hr

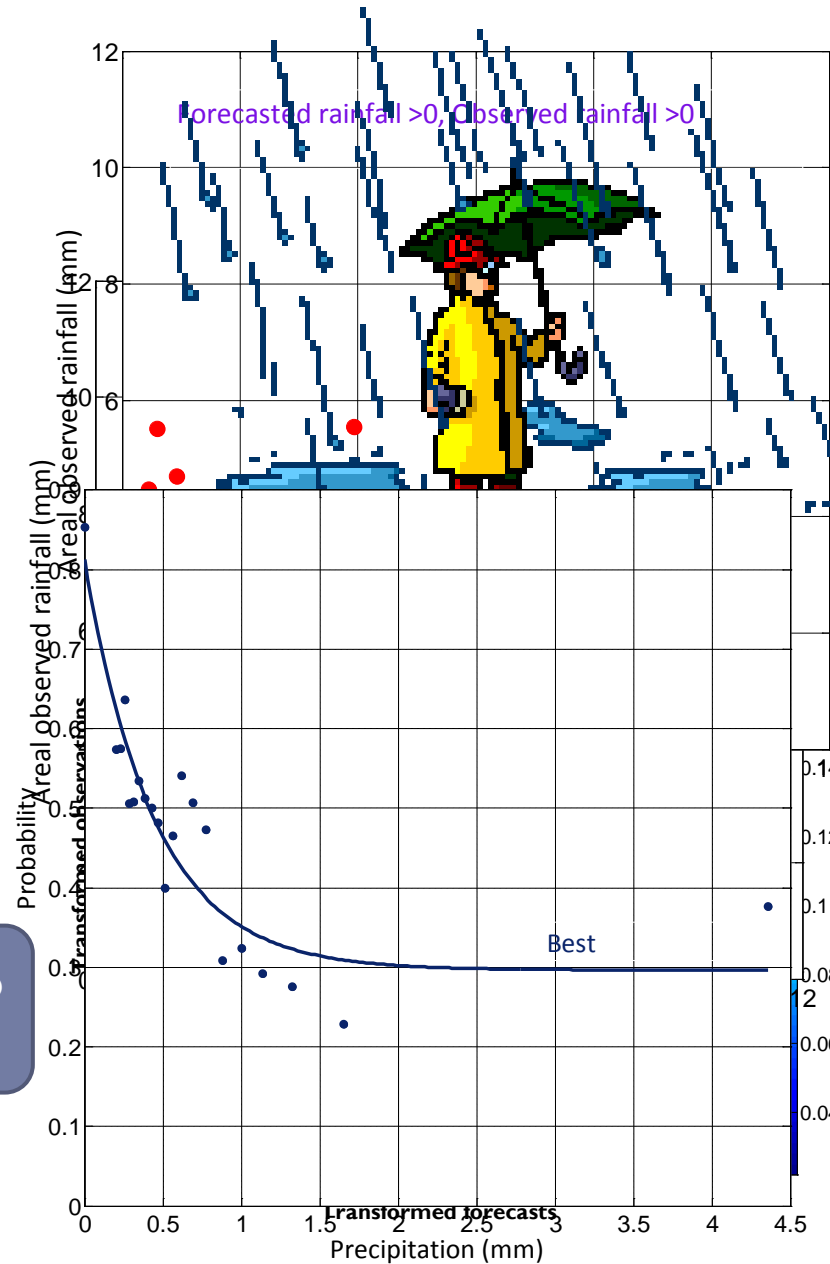
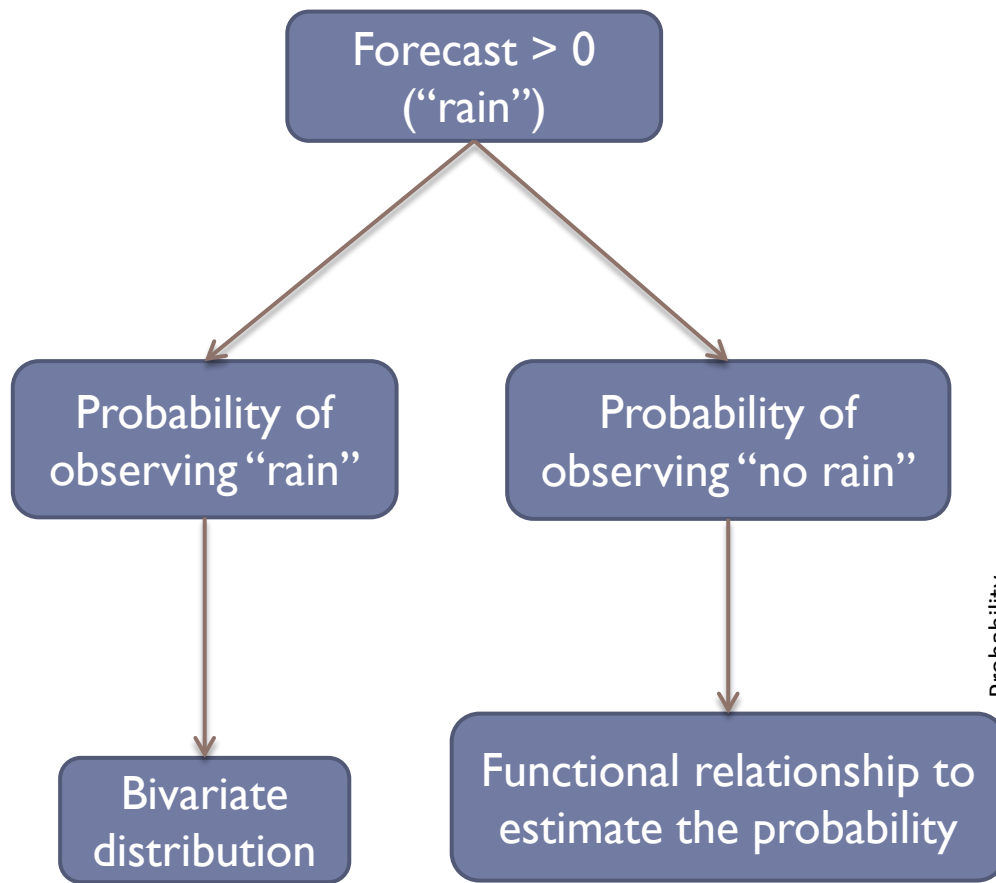
Duration = 2 years of
data

Motivation - Fact

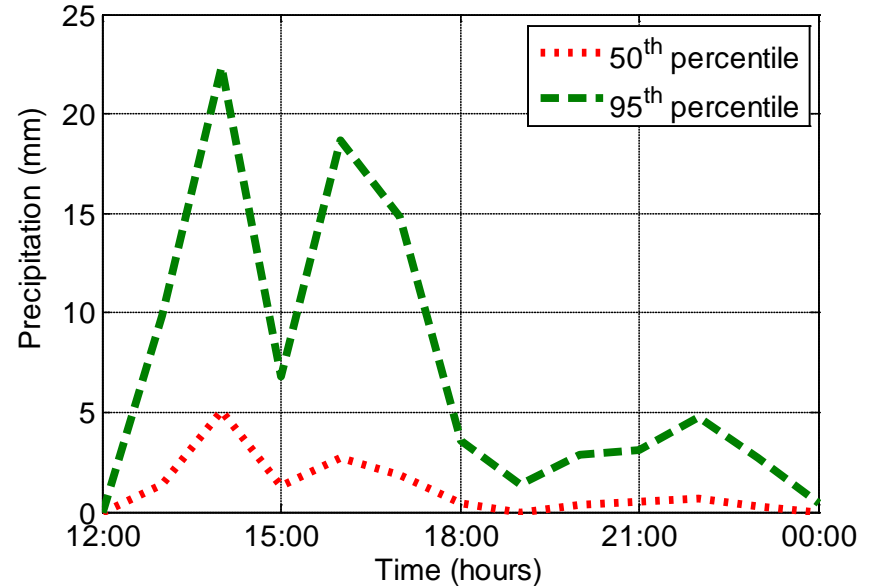
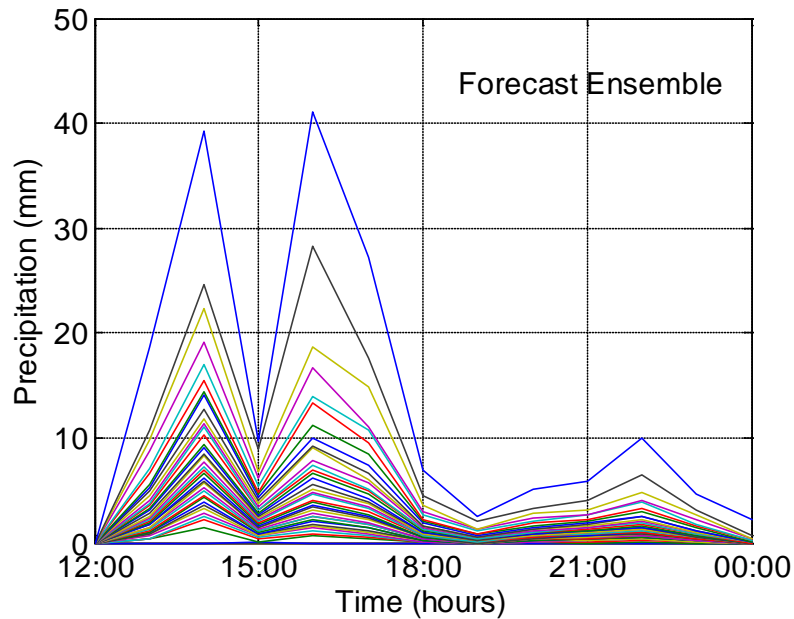
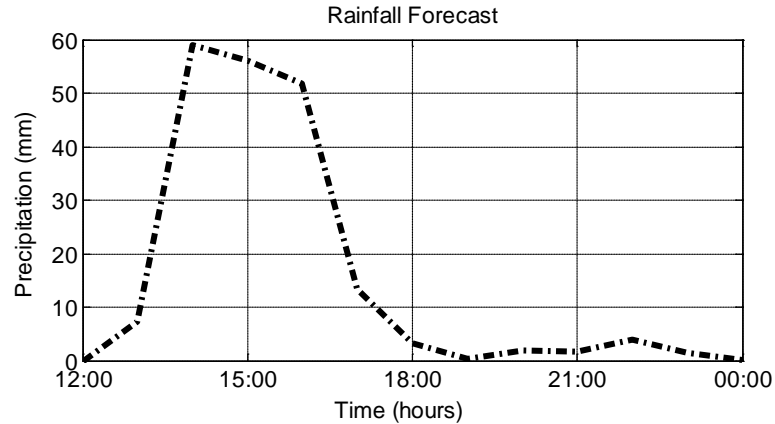
Discrepancy between the forecasted and observed rainfall



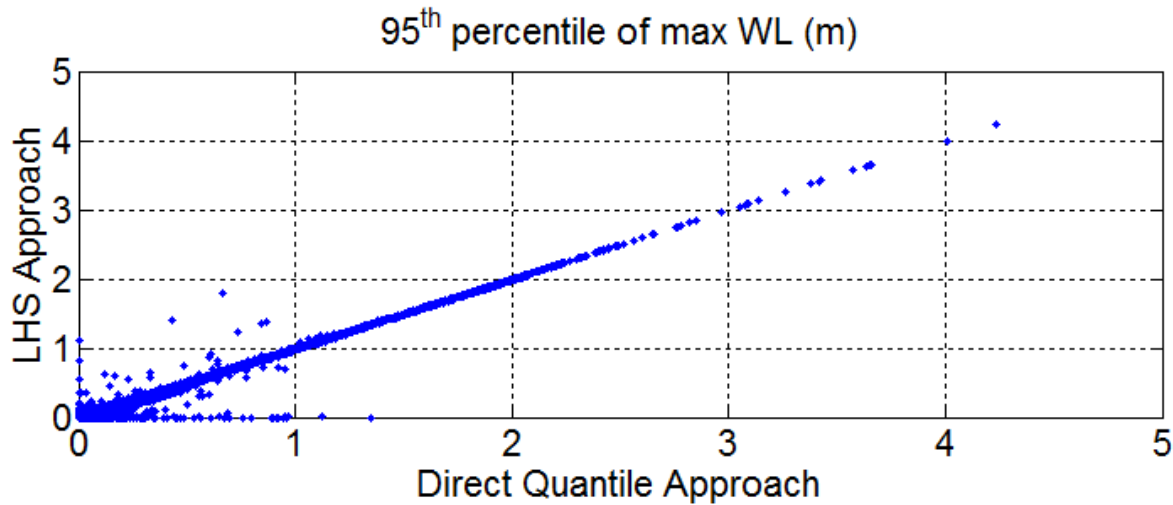
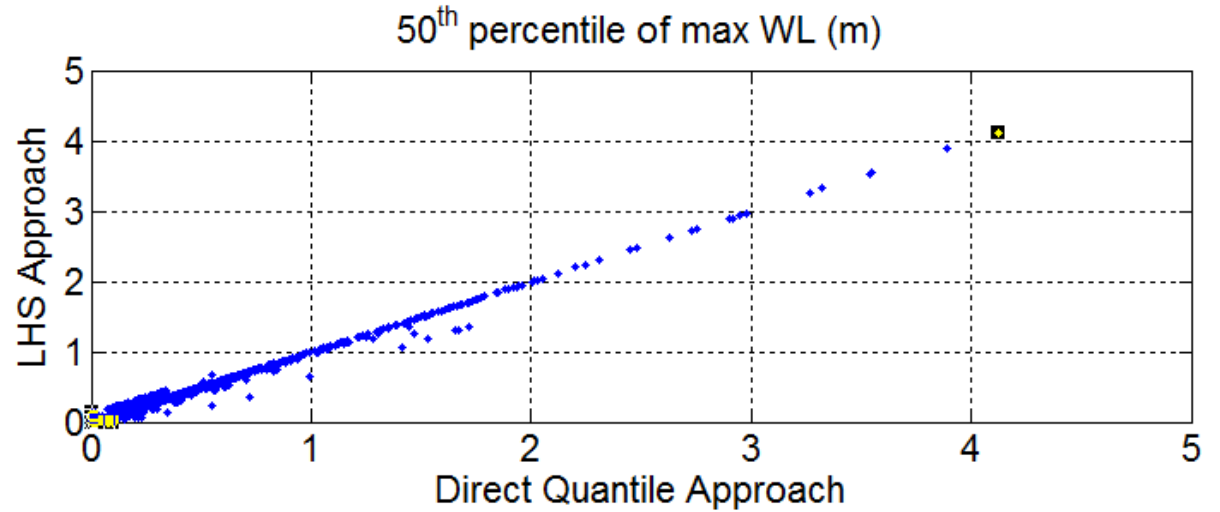




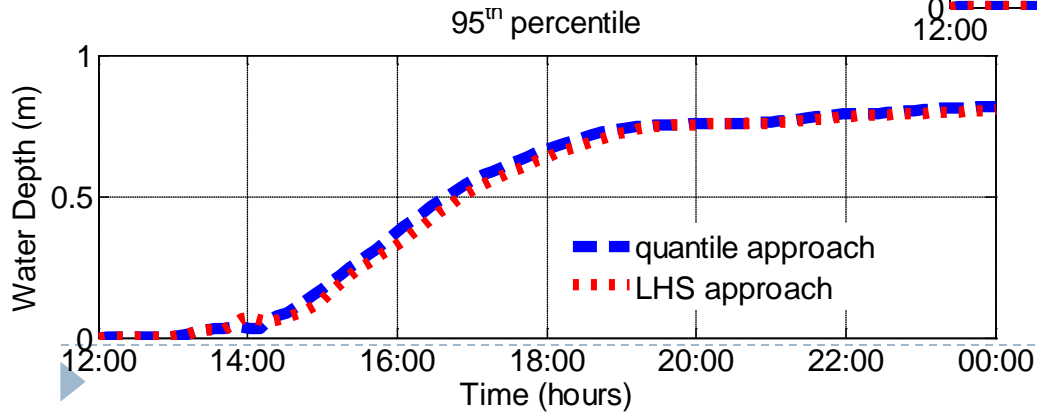
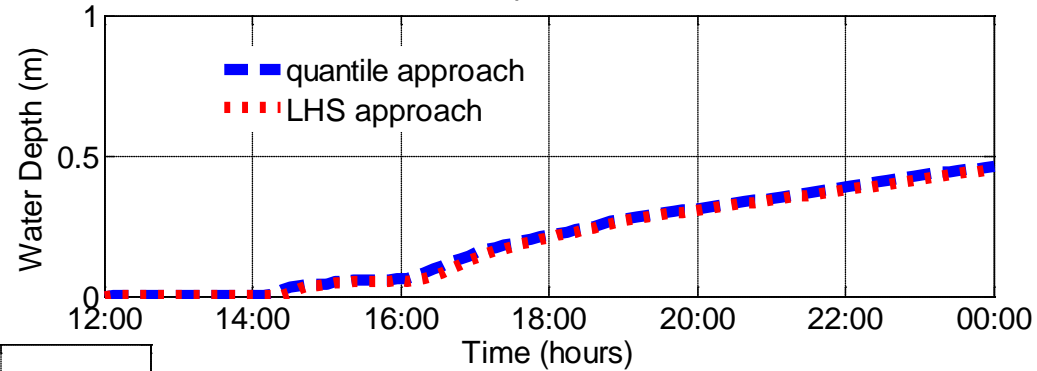
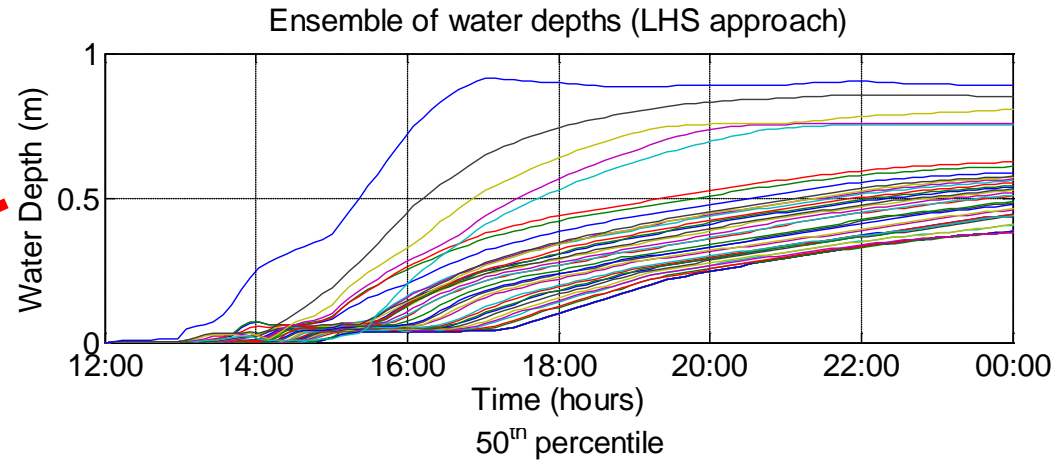
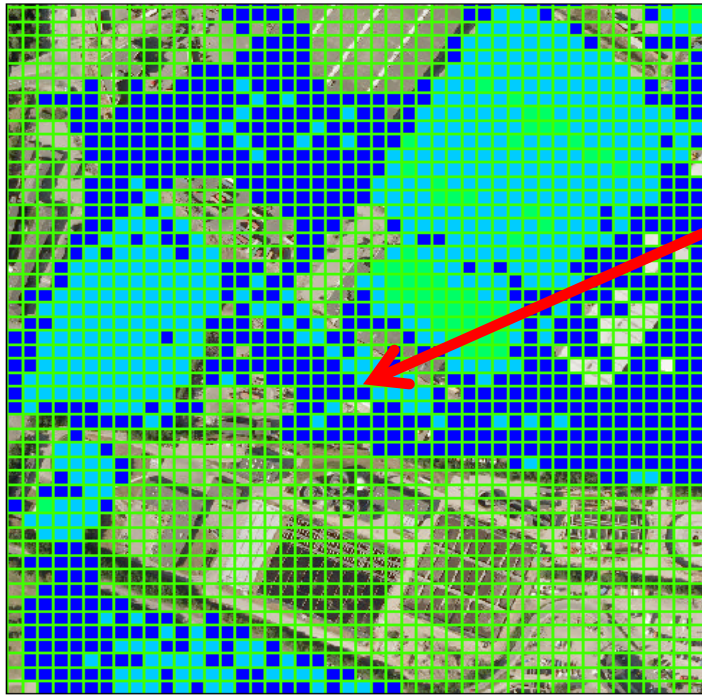
LHS and Direct Quantile Approach



Comparison of max. WL over 2D grid

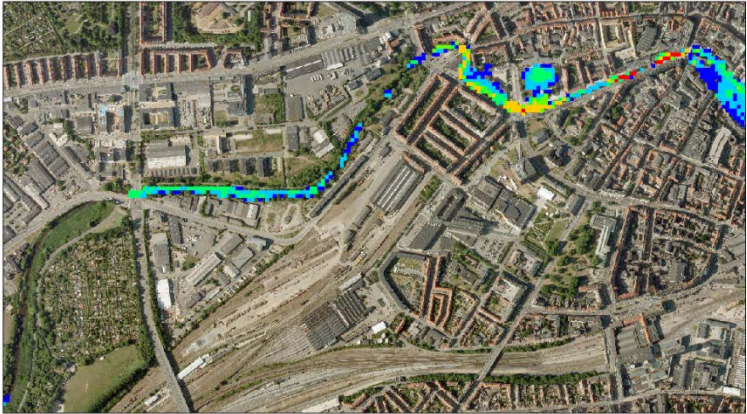


Results from hydrodynamic model



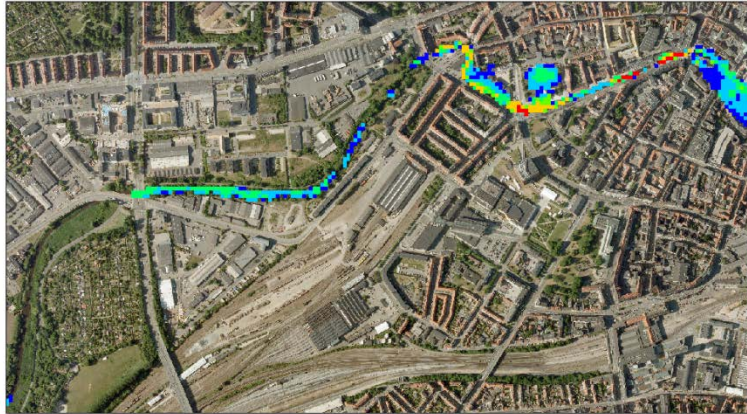
LHS approach

Direct quantile approach



Legend
max depth (m) ■ ■ ■ ■ ■ ■
<0.2 0.2-0.5 0.5-1.0 1.0-1.5 1.5-2.0 >2.0

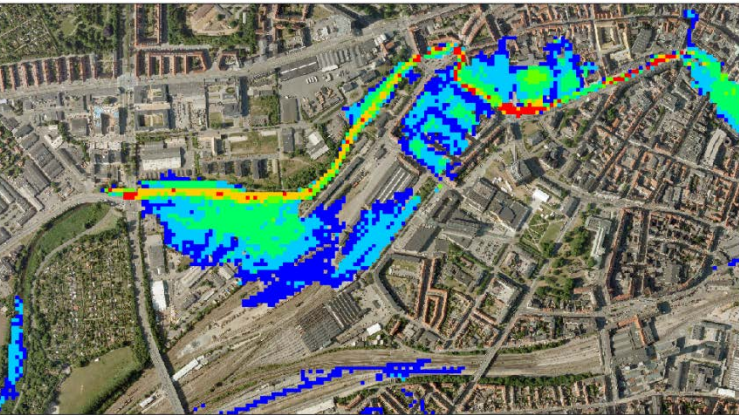
0 170 340 680 Meters



Legend
max depth (m) ■ ■ ■ ■ ■ ■
<0.2 0.2-0.5 0.5-1.0 1.0-1.5 1.5-2.0 >2.0

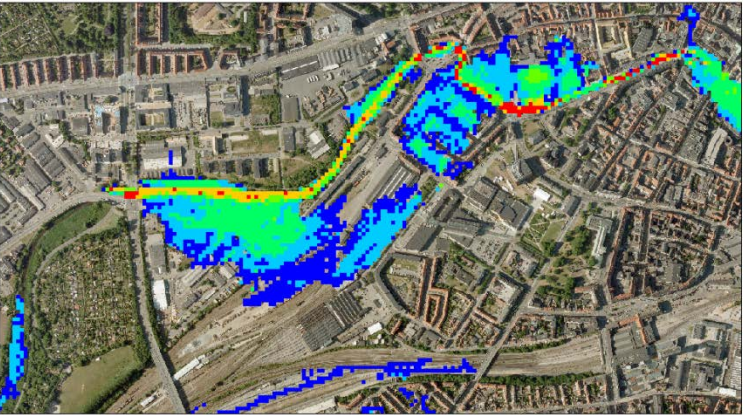
0 170 340 680 Meters

50th percentile



Legend
max depth (m) ■ ■ ■ ■ ■ ■
<0.2 0.2-0.5 0.5-1.0 1.0-1.5 1.5-2.0 >2.0

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Legend
max depth (m) ■ ■ ■ ■ ■ ■
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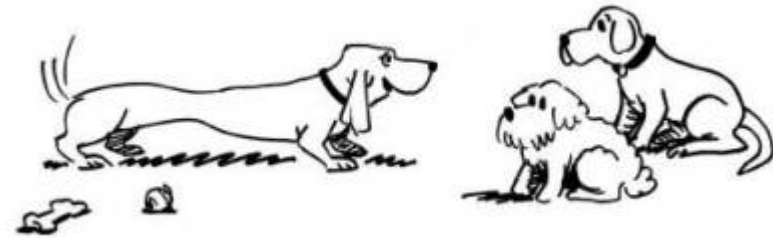
95th percentile



Final thoughts

- ▶ Making decisions under uncertainty is one of the most difficult management decisions but is the **most important one!!!**
- ▶ Addressing uncertainty as a reality shifts the question:
 1. Should a flood warning be issued?
 2. With what confidence it might succeed?





Questions?

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