

# **Rainfall data and insurance damage data related to sewer flooding for the case of Aarhus, Denmark**



**Matthieu Spekkers, Qianqian Zhou, Karsten  
Arnbjerg-Nielsen, Francois Clemens  
and Marie-claire ten Veldhuis**

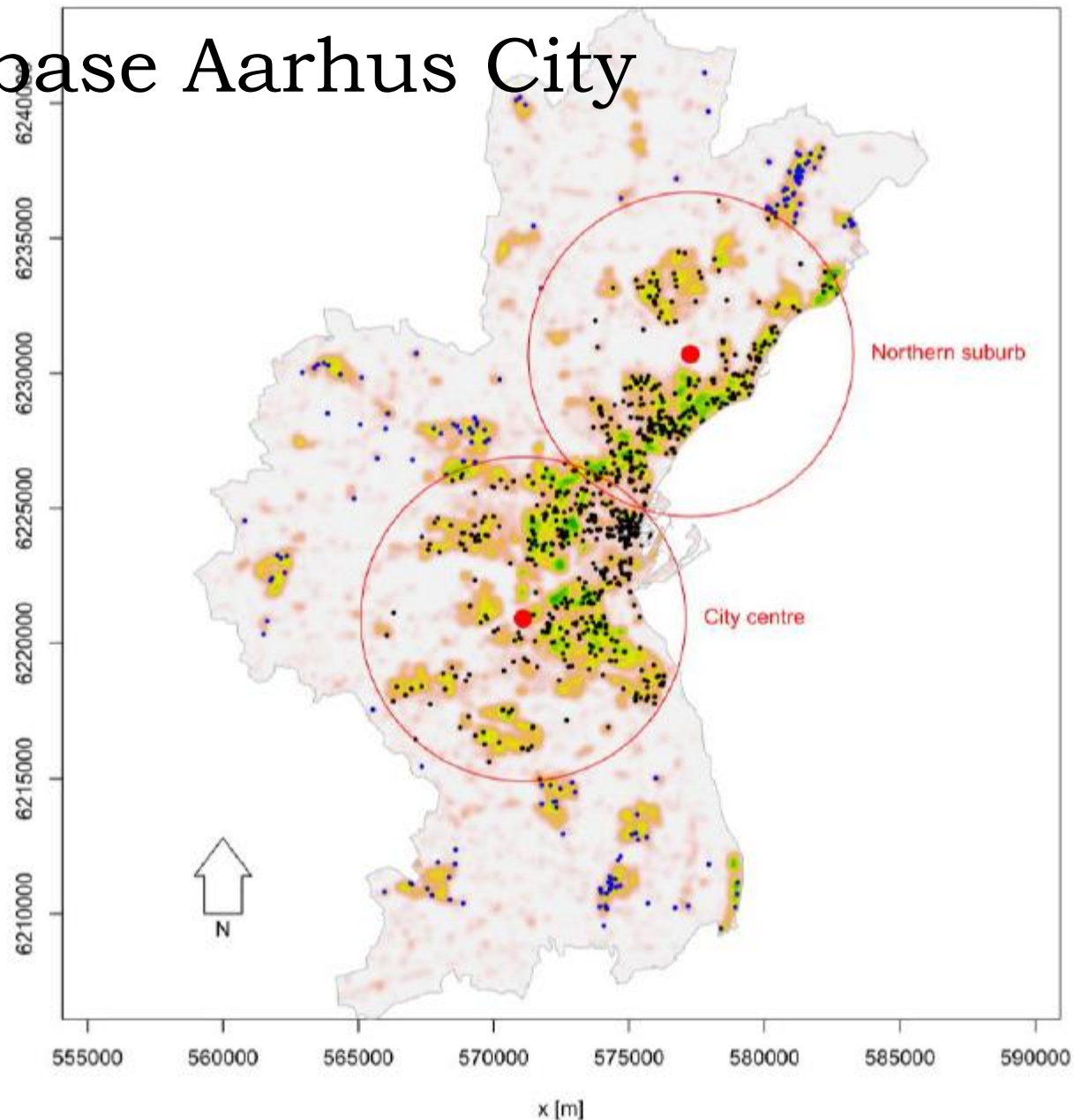
# Rainfall – insurance damage claims: is there a relationship?



# Claim database Aarhus City

Aarhus City:

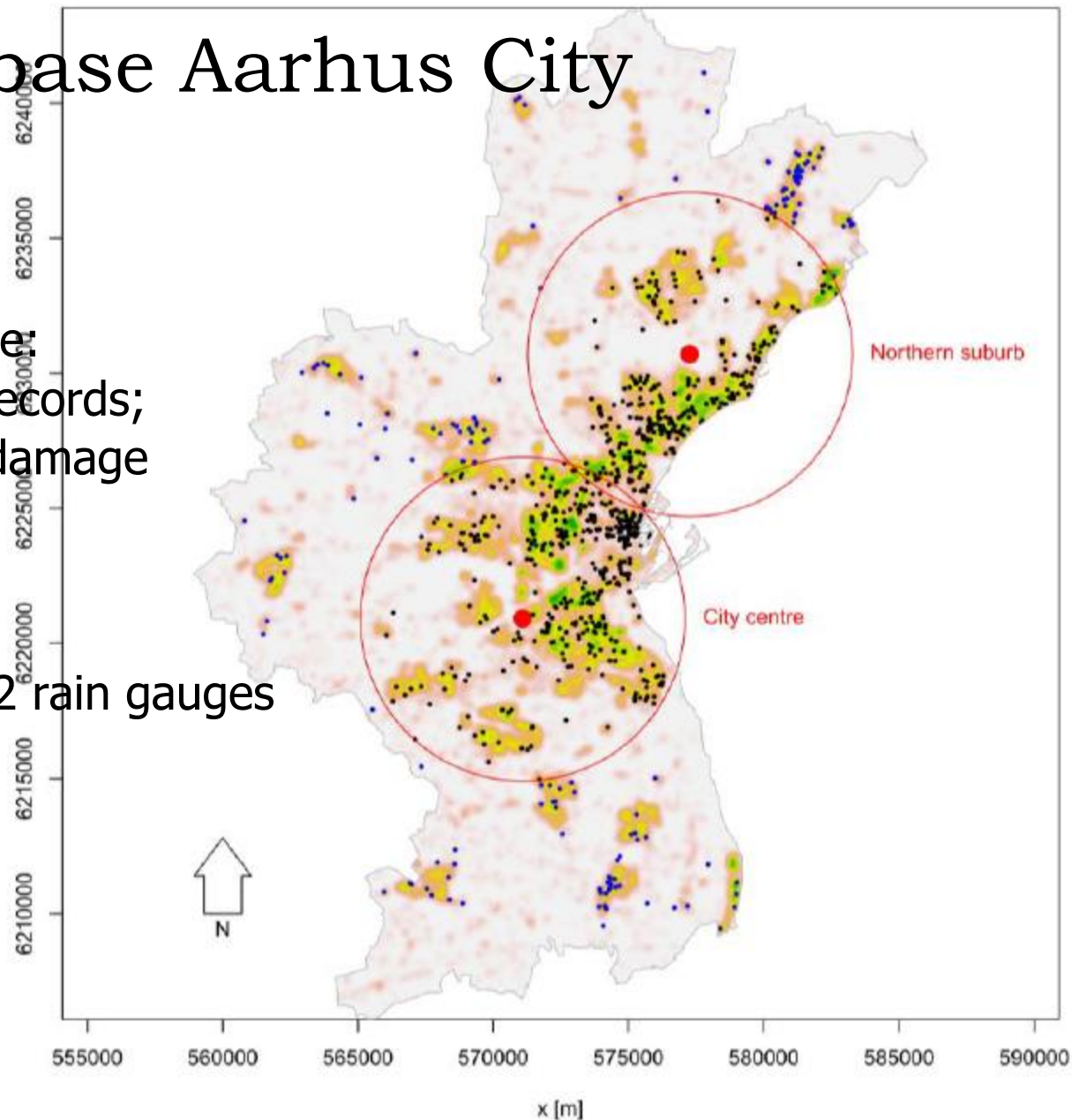
- 315,000 inhabitants
- 47,000 hectares
- Elevation:  
0-107m+MSL



# Claim database Aarhus City

Insurance claim database:

- 1044 geo-referenced records; property and content damage
- 24/7 service
- 813 records used
- within 6 km range of 2 rain gauges
- period 2005-2009



# Relationship rainfall – insurance damage claims?

Problem:

Lagged response of damage claim to time of rainfall  
event causing damage

# Relationship rainfall – insurance damage claims?

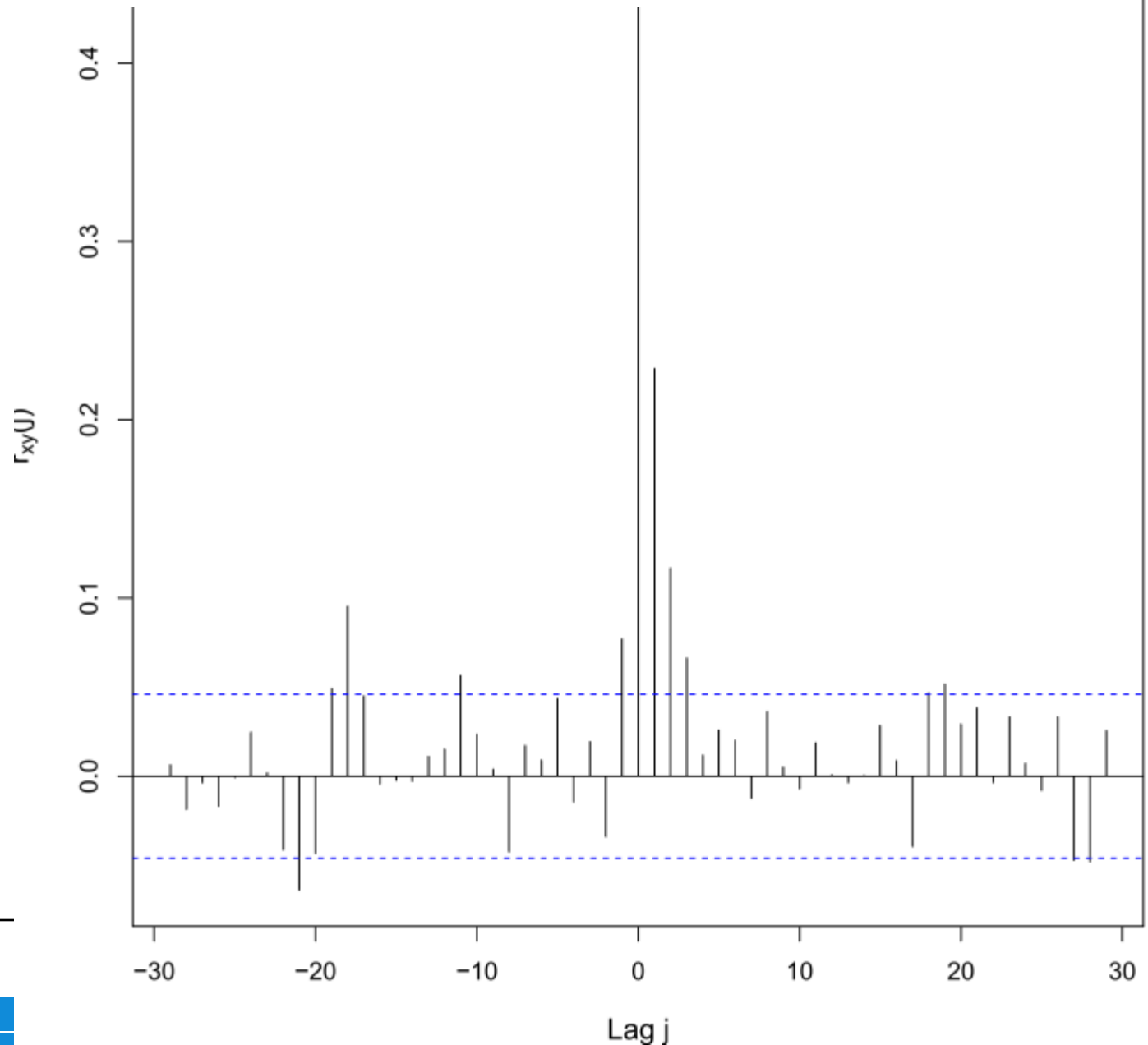
Problem:

Lagged response of damage claim to time of rainfall event causing damage

Solution:

- impulse-response function (lagged regression) – from signal processing (cf. electric pulse)
- Precondition: impulse is short compared to response; impulse is immediate (infinitely short).
  - Here: impulse = rainfall (min-hours); response = claims (days)

Cross correlation max rainfall intensity [mm/h] vs nr of claims [-/day] as a function of lag time [days]

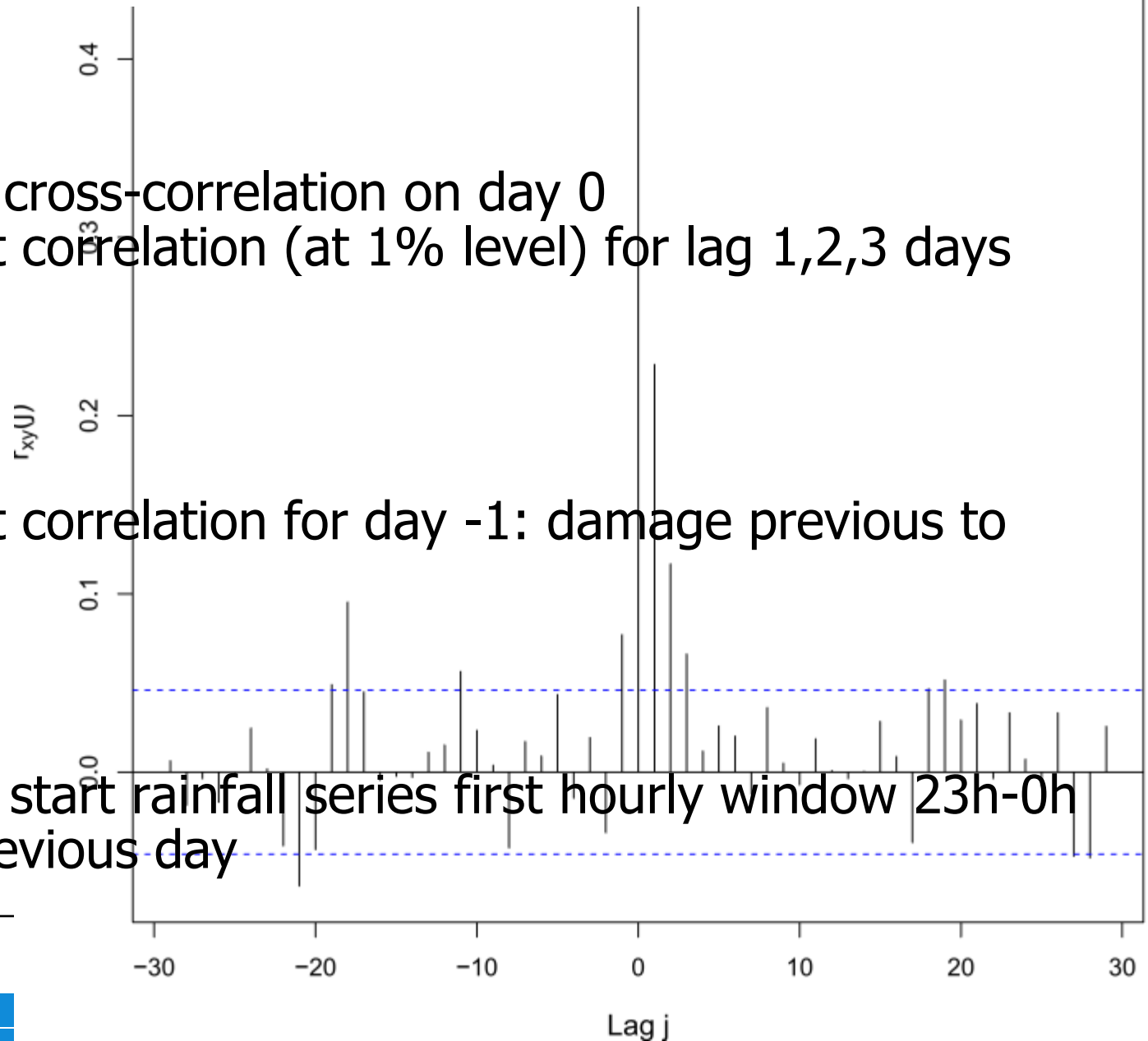


# Cross correlation max rainfall intensity [mm/h] vs nr of claims [-/day] as a function of lag time [days]

- Strongest cross-correlation on day 0
- Significant correlation (at 1% level) for lag 1,2,3 days

- Significant correlation for day -1: damage previous to rainfall?

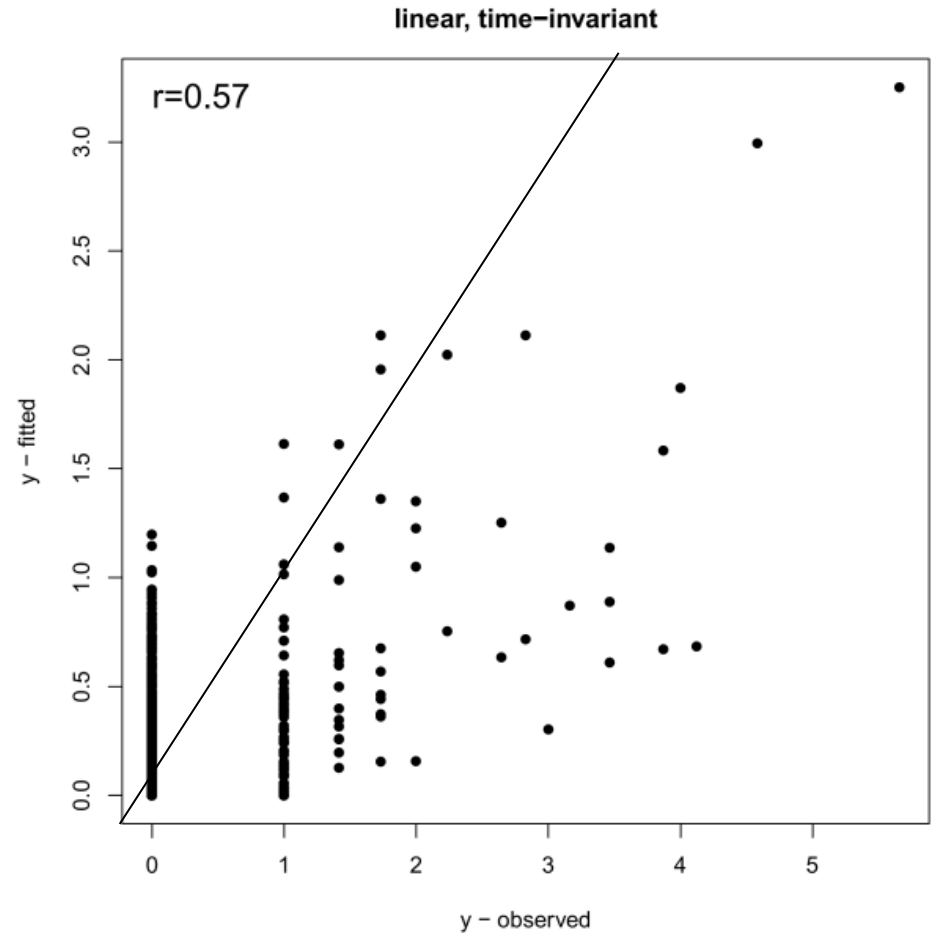
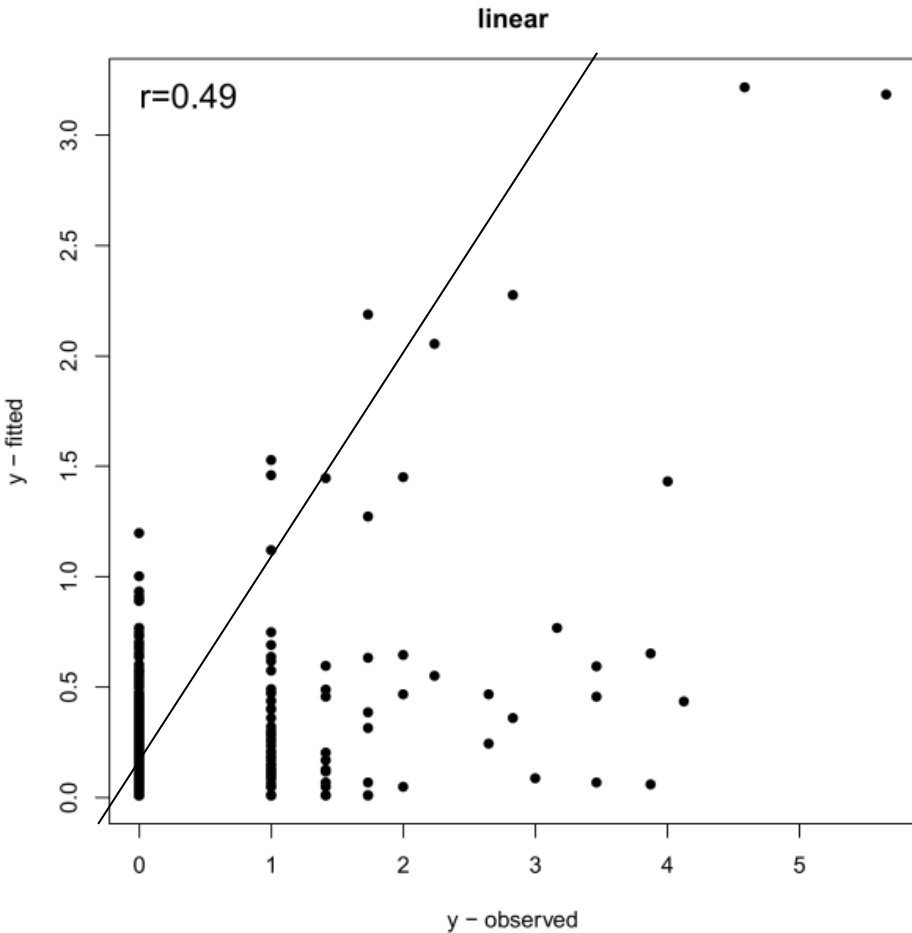
- Probably: start rainfall series first hourly window 23h-0h is from previous day





# Nr of damage claims predicted vs observed

(SQRT(nr claims))



# Correlation coefficients (Pearson)

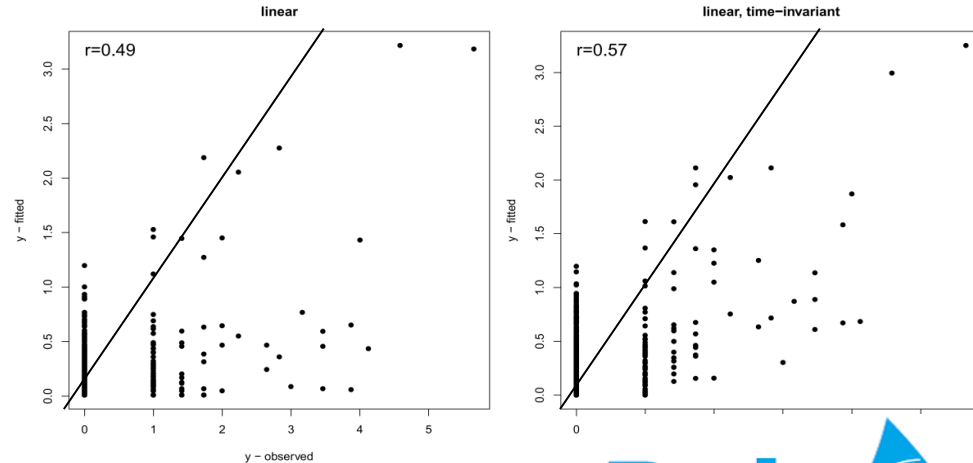
		Northern suburb		City centre	
Model		dcounts	dtot	dcounts	dtot
rmax	Linear	0.49	0.45	0.40	0.37
	Linear, time-invariant	0.57	0.53	0.47	0.43
rvol	Linear	0.45	0.40	0.38	0.34
	Linear, time-invariant	0.54	0.48	0.44	0.38
Avg. distance claim-rain gauge		3.1 km		4.0 km	
Total number of claims		363		450	

D\_counts: nr of damage claims/day

D\_tot: total damage volume/day

# Prediction of rainfall-related damage

Needs for improvement:



- accurate insurance data: in time and space
- accurate rainfall data: especially in space (rainfall radar)
- additional data sources: topography, local drainage, socioeconomic data





**Acknowledgments:**  
Forsikring and Pension  
DTU  
FP7 SMARTeST

