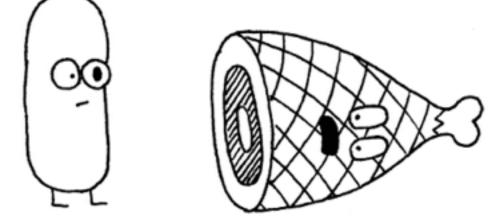




## A polynomial-time ambulance redeployment policy

Call a hambulance!



1<sup>st</sup> International Workshop on Planning of Emergency Services **Caroline Jagtenberg** R. van der Mei S. Bhulai



#### Overview

- EMS: Static vs Dynamic Solutions
- Performance Estimation
- Our proposed method
- A tractable case study
- A realistic case study

CWI Emergency Medical Services

- 1. Accident occurs
- 2. Closest idle ambulance is sent
- 3. Ambulance arrives at accident scene
- 4. Patient may need transportation to hospital
- 5. Ambulance becomes available

How to position ambulances in order to minimize response times?



## Problem formulation

Given:

- Locations of bases
- Number of available ambulances
- Expected demand at every location
- Driving times between locations

Optimize:

- Distribution of idle ambulances over the bases in order to minimize fraction arrivals later than a certain threshold time (patient friendly)
- We may relocate an ambulance <u>only</u> when it becomes idle (crew friendly)

## CWI Static vs dynamic solutions

- Static solution: each ambulance is sent back to its 'home base' whenever it becomes idle.
  - Note: the ambulance does not need to arrive there, it can be dispatched while on the road
  - A solution is a base for each ambulance
- Dynamic solution: make decisions based on current realizations (e.g., locations of accidents, which ambulances are idle, etc.)
  - A solution describes how to redistribute ambulances



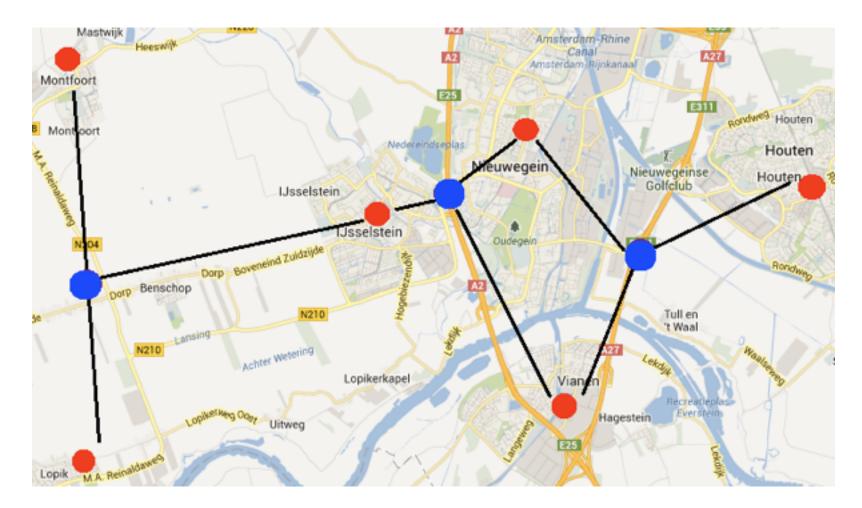
## Estimating performance

Simulation model:

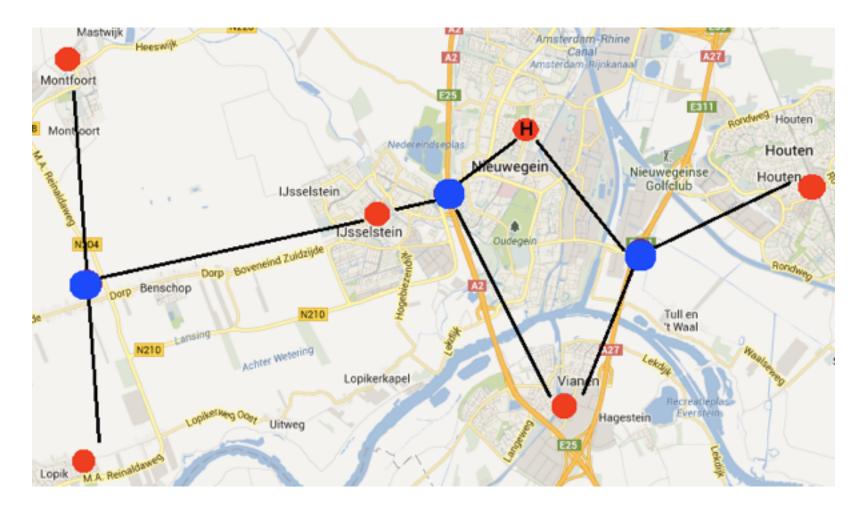
- Specify locations (x,y,p)
- Calls arrive according to a Poisson distribution
- Closest idle ambulance is sent
- Patient needs hospital treatment w.p. 0.8
- When an ambulance becomes idle, make a decision (relocation)

 <u>Performance</u> (cost) is measured by the fraction of ambulances arriving later than a certain threshold



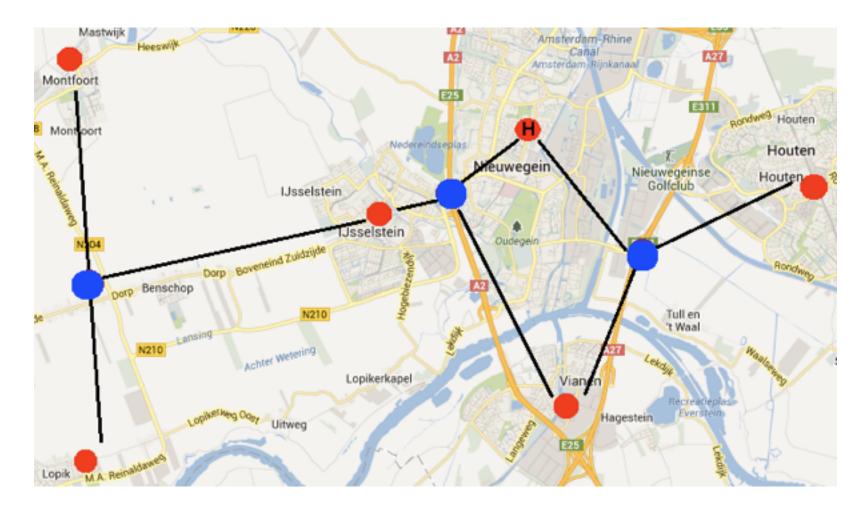






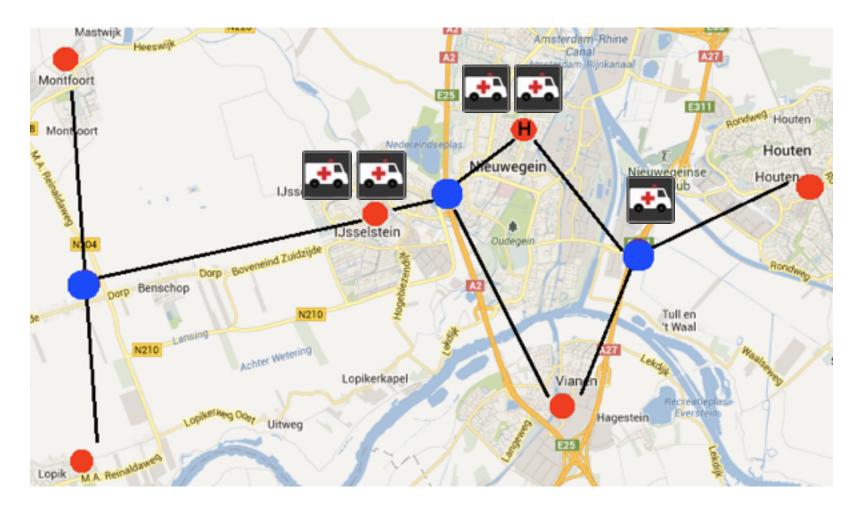


#### The best static solution?





#### The best static solution:





### Dynamic solution: Ambulance redeployment policy

Previous work:

- R. Alanis, A. Ingolfsson, B. Kolfal (2013)
- 'A Markov Chain Model for an EMS System with Repositioning'
- M. S. Maxwell, S. G. Henderson,
  H. Topaloglu (2009)

'Ambulance redeployment: An Approximate Dynamic Programming Approach'



Maximum Expected Covering Location Problem (MEXCLP) Daskin, 1983

Uses a pre-determined 'busy fraction' q: If a demand node has k ambulances nearby, the node is covered w.p. 1 -  $q^k$ 

Let d<sub>i</sub> be the demand at location i. Then the coverage of location i is given by:

 $E_k = d_i(1-q^k)$ 



#### Dynamic MEXCLP

- Only consider currently idle ambulances
- Pretend moving ambulances are already at their destination
- At a decision moment, calculate marginal contribution in coverage for each possible base:

$$E_k = d_i(1 - q^k) \to E_k - E_{k-1} = d_i(1 - q)q^{k-1}$$

 Choose the base that yields the largest marginal contribution (greedy)



## **Computation Time**

- O( |W| \* |A| \* |J| )
  Where:
  - W are the base stations
  - A are the ambulances
  - J are the demand nodes

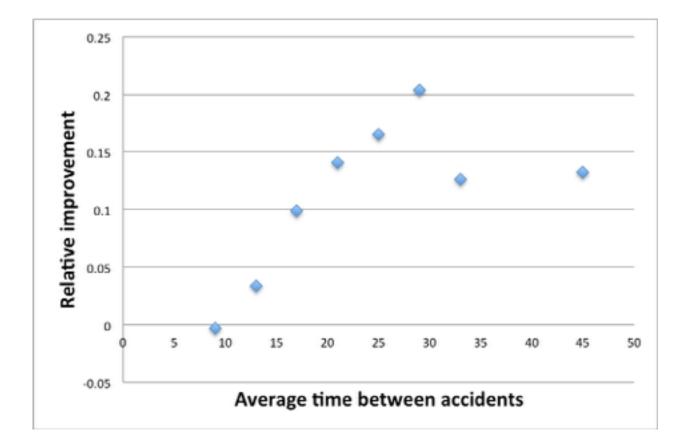


#### Performance

- Benchmark: the best static policy has a performance of ~ 7.4%
- The Dynamic MEXCLP heuristic has a performance of ~ 6.2%



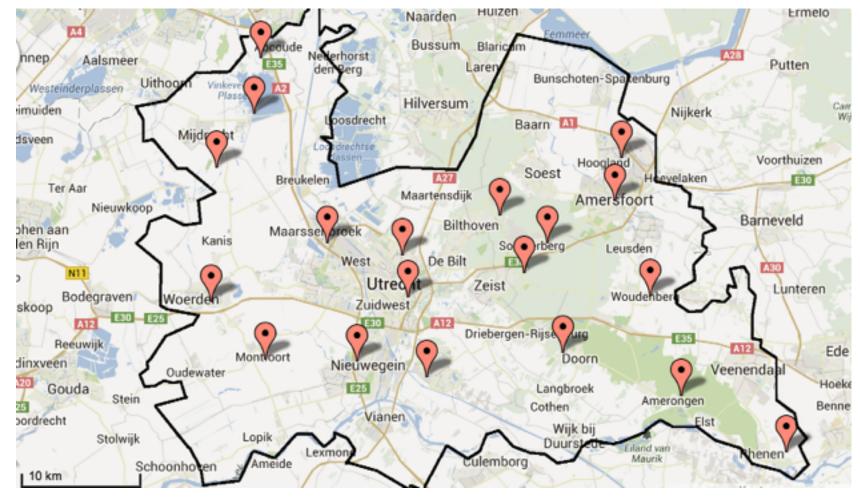
#### Performance







# A larger, more realistic region

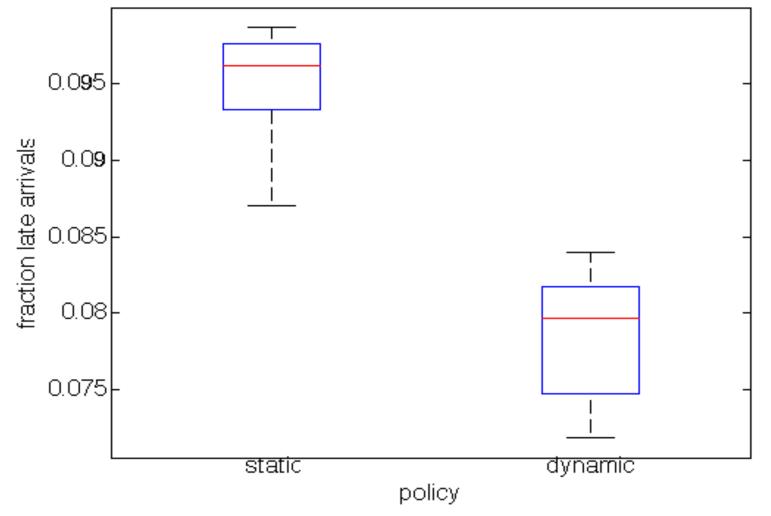


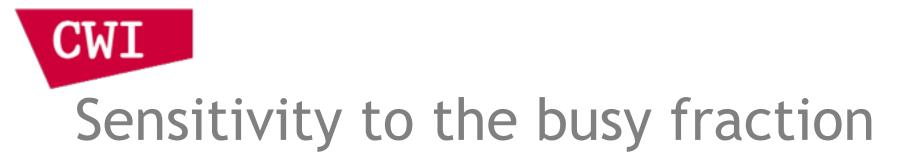
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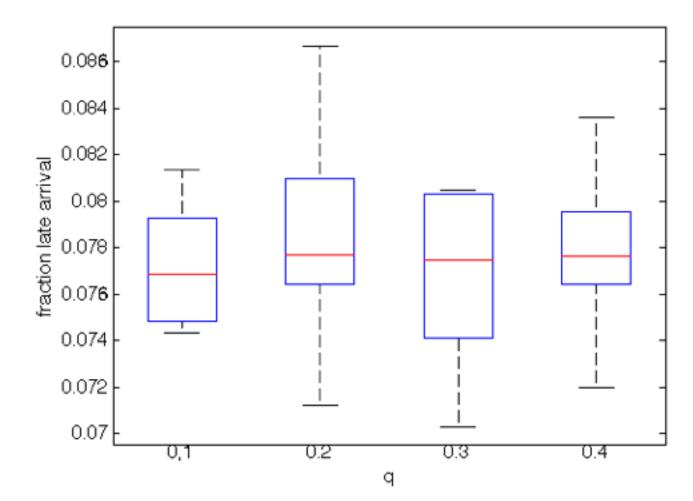
CWI



#### Static and dynamic MEXCLP policy

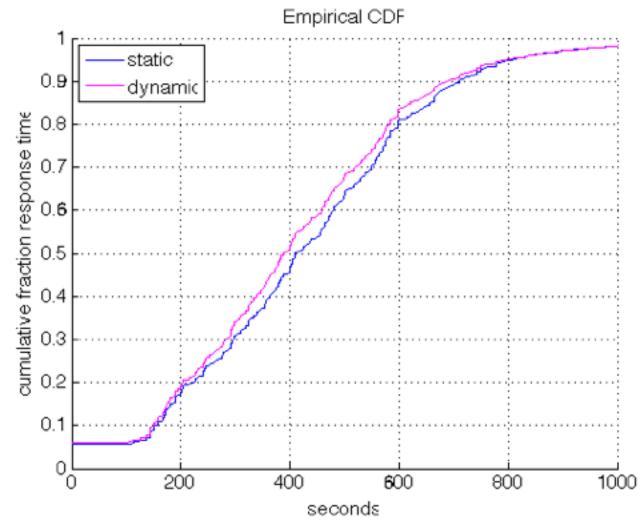








#### **Response times**



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### Possible improvements

 Also taking into account ambulances that will become available soon

 Calculate the trade-off between distance and coverage improvement





#### Thank you for your attention

#### **Questions**?