

Human behaviour in large scale evacuation events

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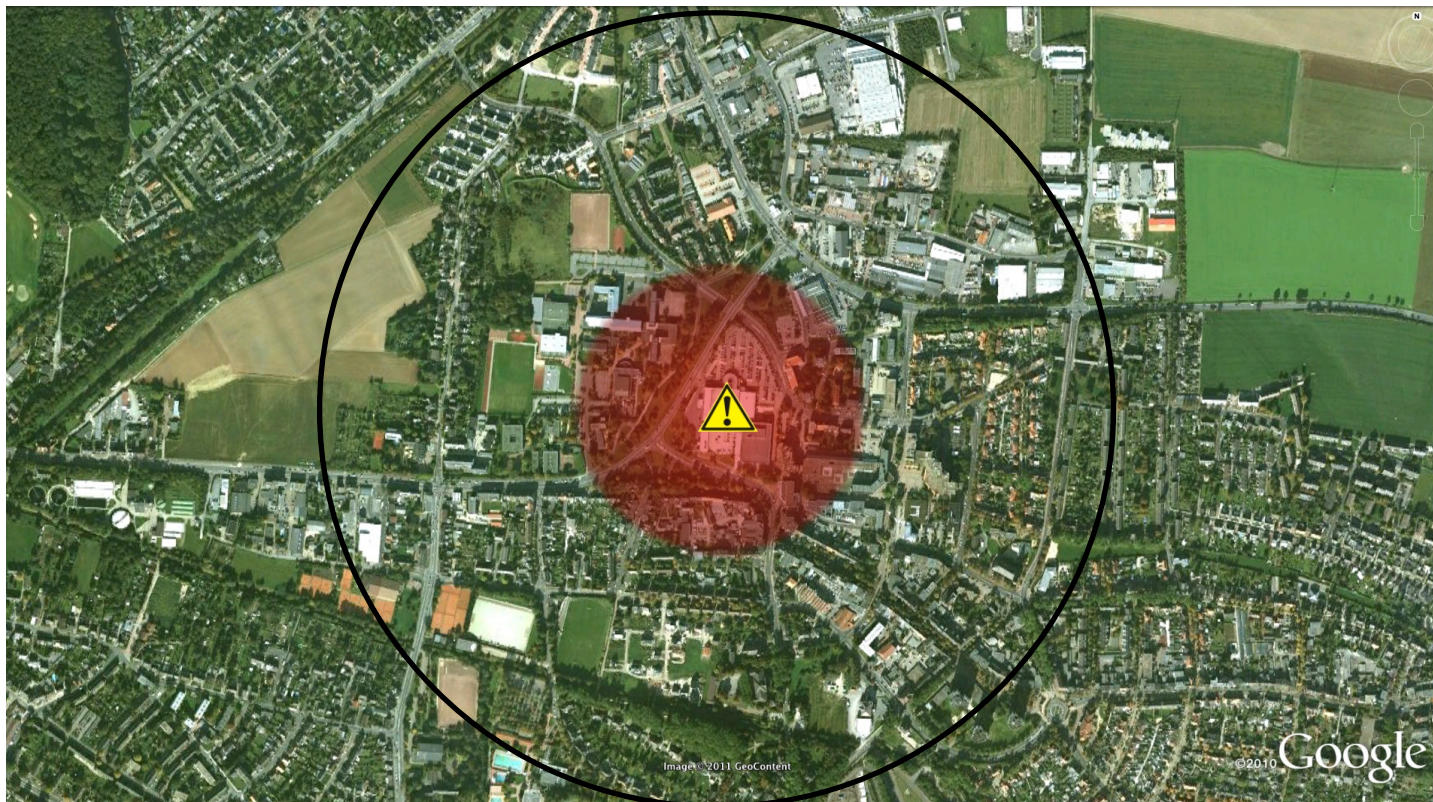
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Definition: Large scale evacuation

- Areas of at least 3 km in diameter
- E.g. cities, towns, districts, villages, not single objects or households



Motivation

IVT simulates evacuation events in MATSim

Behavioural model in MATSim is Homo Economicus

Motivation (2)

Homo Economicus



→ Collect information on human behaviour in evacuations and estimate more realistic behavioural model

Collecting data: Triangulated methodology

1. Literature research
2. Expert interviews
3. Survey study

Expert interviews: Results

| Hypotheses: Participation for an evacuation | Influence |
|---|-----------|
| ...increases for 'life-threatening' evacuation reasons | +++ |
| ...decreases for natural disasters | ++ |
| ...decreases if time span is too large or too narrow | + |
| ...decreases with available information from reliable sources | ++ |
| ...increases if people have to care for others | +++ |
| ...increases for people without emotional relations | ++ |
| ...increases when family is united | +++ |
| ...decreases for old people and young adults | +++ |
| ...decreases for people from 'isolated' sub-groups | +++ |
| ...decreases for people with high value private property | +++ |
| ...decreases for males | + |
| ...is likely for most people | +++ |
| ...is often done in own car | +++ |
| ...is done in a pro-social way of behaviour | + |
| ...includes that most people find private accommodations | ++ |
| ...depends on an interaction between reason and information | ++ |

Survey study: Stated choice experiment

| Attributes | Flood | Chemical accident | Nuclear accident | Fire, toxic gasses |
|--------------------------------|--|--|--|------------------------------------|
| Source of initial warning | | 1. Siren 2. Mass media (Radio & TV) 3. Social contacts | | |
| Source of warning confirmation | | 1. Rescue teams (Police & fire fighters) 2. Mass media (Radio & TV) 3. Social contacts | | |
| Status of household community | | 1. United 2. Divided | | |
| Time for evacuation | 1. Immediately 2. 8 hours 3. 16 hours | 1. Immediately 2. 8 hours | 1. Immediately 2. 8 hours 3. 16 hours | 1. Immediately |
| Distance to evacuation source | 1. 2 kilometers 2. 5 kilometers | 1. 2 kilometers 2. 5 kilometers | 1. 2 kilometers 2. 5 kilometers 3. 10 kilometers | 1. 2 kilometers 2. 5 kilometers |
| Distance to evacuation border | 1. 2 kilometers 2. 5 kilometers | 1. 2 kilometers 2. 5 kilometers | 1. 2 kilometers 2. 5 kilometers 3. 10 kilometers | 1. 2 kilometers 2. 5 kilometers |
| Choice | 1. Immediate evacuation; 2. Later evacuation; 3. No evacuation | | | |

MNL Model

BIOGEME

$$V_{\text{imm}} = ASC_{\text{imm}}$$

$$+ \beta_{\text{atom}}^1 * d_{\text{atom}} + \beta_{\text{chemie}}^1 * d_{\text{chemie}} + \beta_{\text{fire}}^1 * d_{\text{fire}}$$

$$+ \beta_{\text{age30}}^1 * d_{\text{age30}} + \beta_{\text{age60}}^1 * d_{\text{age60}}$$

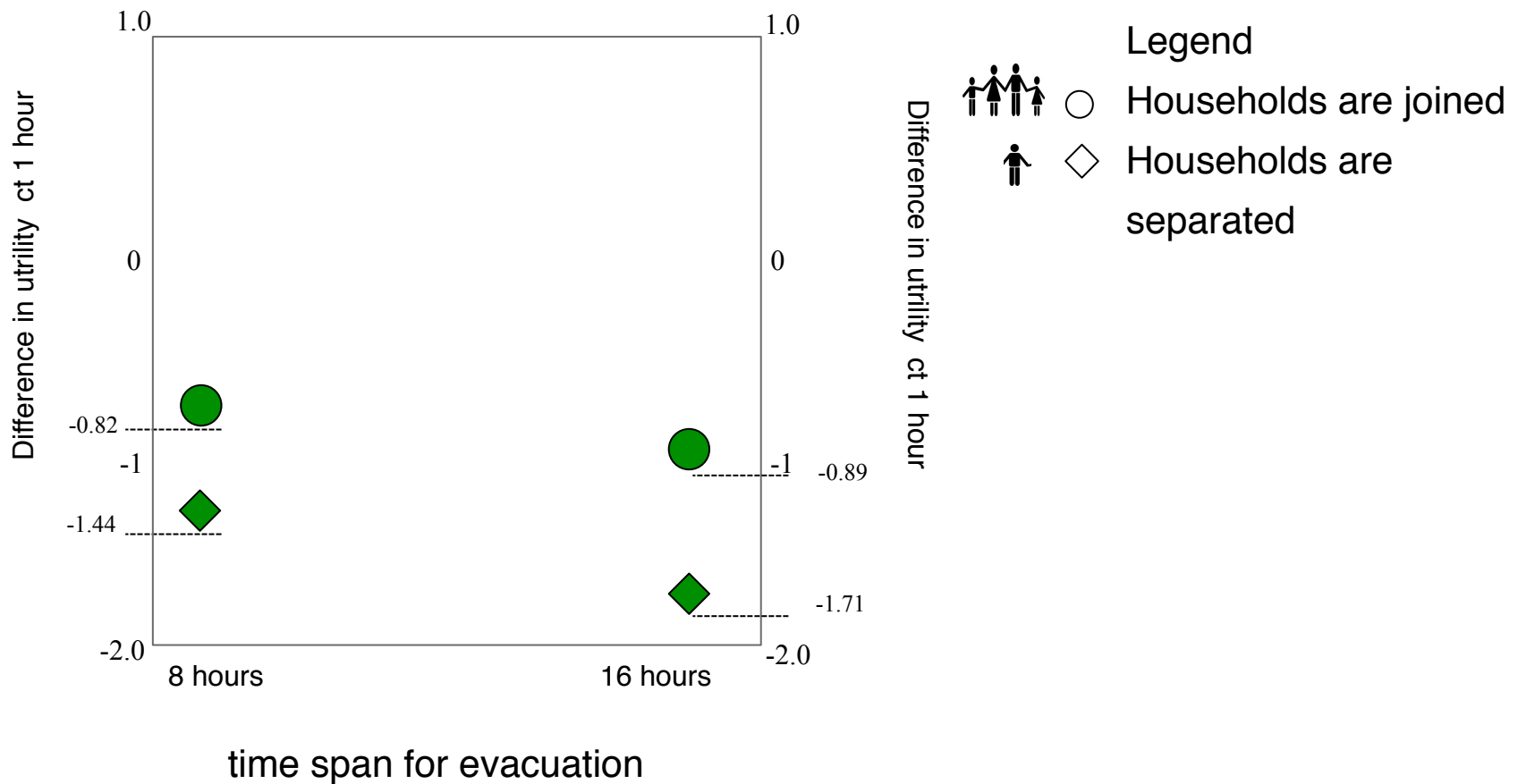
$$+ \beta_{\text{time8}}^1 * (1 + \beta_{\text{hhunit1}}^1 * d_{\text{hhunit}}) * d_{\text{time8}} + \beta_{\text{time16}}^1 * (1 + \beta_{\text{hhunit2}}^1 * d_{\text{hhunit}}) * d_{\text{time16}}$$

Survey study: MNL-Model of stated choices

| Coefficient | Alternative: Evacuate immediately | | Alternative: Evacuate later | |
|-------------------|-----------------------------------|---------|-----------------------------|---------|
| | value | t-value | value | t-value |
| Constant | 2.93 | 14.55 | 2.19 | 9.40 |
| Chemical accident | 1.40 | 3.33 | 0.89 | 2.14 |
| Nuclear accident | 1.72 | 8.70 | 0.60 | 3.11 |
| Fire, toxic gases | 0.54 | 1.57 | 0.29 | 0.80 |
| Age 31 - 60 | -0.36 | -3.63 | -0.00 | -0.00 |
| Age > 60 | -0.60 | -3.88 | -0.00 | -0.00 |
| Time 8 hours | -1.44 | -5.87 | 0.55 | 2.26 |
| Household united | -0.43 | -2.32 | -0.62 | -1.24 |
| Time 16 hours | -1.71 | -6.97 | 0.39 | 1.63 |
| Household united | -0.48 | -3.34 | 0.12 | 0.16 |

Rho² = 0.365
N = 7232

Effect of spatial segregation of household members



Factor analysis

| Variable | Factor 1 (care takers) | Factor 2 (assistance needy) |
|-----------------|---------------------------|--------------------------------|
| Children | 0.67 | |
| Partner | 0.52 | |
| DriverLic | 0.18 | -0,48 |
| PublicTransport | -0.18 | 0.27 |
| Student | | 0.15 |
| Age > 60 | -0.27 | |
| Income_High | 0.24 | -0.12 |

Latent class model

Indicators: households with children & driver license

Class “care takers” : household members: joined/ separated

Class “assistance needy” : influence of age

ρ^2 : 0,391 (compared to basic model of 0,365)

Marginal differences: Latent classes vs basic MNL

| | Evacuate immediately | Evacuate later |
|-------------------|----------------------|----------------|
| Coefficient | value | value |
| Constant | 1,91 | 1,17 |
| Chemical accident | 0,36 | 0,18 |
| Nuclear accident | 0,21 | 0,09 |
| Fire, toxic gases | 0,05 | 0,01 |
| Age 31 - 60 | -2,76 | -1,90 |
| Age > 60 | -2,89 | -2,13 |
| Time 8 hours | -0,22 | -0,09 |
| Household united | -0,30 | -2,33 |
| Time 16 hours | -0,28 | -0,12* |
| Household united | -0,15 | -1,81* |

* = not significant

Other input for MATSim

1. Addresses at 12 am, 9 am, 5 pm → geo coordinates



2. Car-sharing model

Conclusion

- Behaviour of people can be included in MATSim
- Cause of accident, age, time span available and household status have impact on evacuation decision
- Account for latent classes

But...

Evacuation is an exceptional event.

More latent classes?

Outlook

- Comparison with other models
- Sensitivity analysis of relevant parameters in MATSim
- Re-run evacuation scenarios with estimated parameters
- Compare simulation results

Dinner time!

Thank you for your attention!



Dinner time!

Thank you for your attention!



Dinner time!

Back-up slides



Representativeness

| | Attribute | Survey data | Microcensus Switzerland |
|--|------------------|-------------|-------------------------|
| Sex [%] | Male | 50.3 | 49.7 |
| | Female | 49.0 | 51.3 |
| Civil status [%] | Single | 25.3 | 29.9 |
| | Married | 58.1 | 54.5 |
| | Divorced | 11.0 | 7.60 |
| | Widowed | 3.6 | 6.6 |
| | Living separated | 2.0 | 1.4 |
| Age [% of people in class Ø age within the class] | 0-20 | 0.7 19.3 | 0.05 19.0 |
| | 21-40 | 29.7 31.7 | 28.9 31.4 |
| | 41-60 | 43.7 50.4 | 31.0 50.0 |
| | 61-80 | 25.8 67.7 | 18.5 69.4 |
| | 81+ | 0.1 84 | 2.8 84.6 |
| Household income | <8000 | 57.9 | 73.0 |
| | 8001 – 12000 | 28.2 | 19.1 |
| | >12.000 | 13.9 | 7.9 |
| Citizenship | Swiss | 91.9 | 80.0 |
| | German | 2.6 | 2.3 |
| | French | 0.4 | 1.3 |
| | Italian | 1.2 | 4.6 |
| | Other | 4.0 | 11.8 |
| Drivers license | Available | 91.8 | 80.7 |
| | Not available | 8.2 | 19.3 |