

# **Bevorzugter Zitierstil für diesen Vortrag**

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Axhausen, K.W. (2015) Smart cards and social networks: Simulation and familiar strangers, presentation at the Excellence in data science, Politecnico di Torino, October 2015.

# Smart cards and social networks: Results and familiar strangers

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# Acknowledgements

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Social networks:

- Timo Ohnmacht
- Andreas Frei
- Matthias Kowald
- Lijun Sun
- Andreas Diekmann, ETH Zürich
- Jonas Larsen, Roskilde/John Urry, Lancaster

Agent-based models

- Thibaut Dubernet
- Pieter Fourie

Social network generation

- Theo Arentze, TU Eindhoven

## Further acknowledgements

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Most of the materials and more will be in:

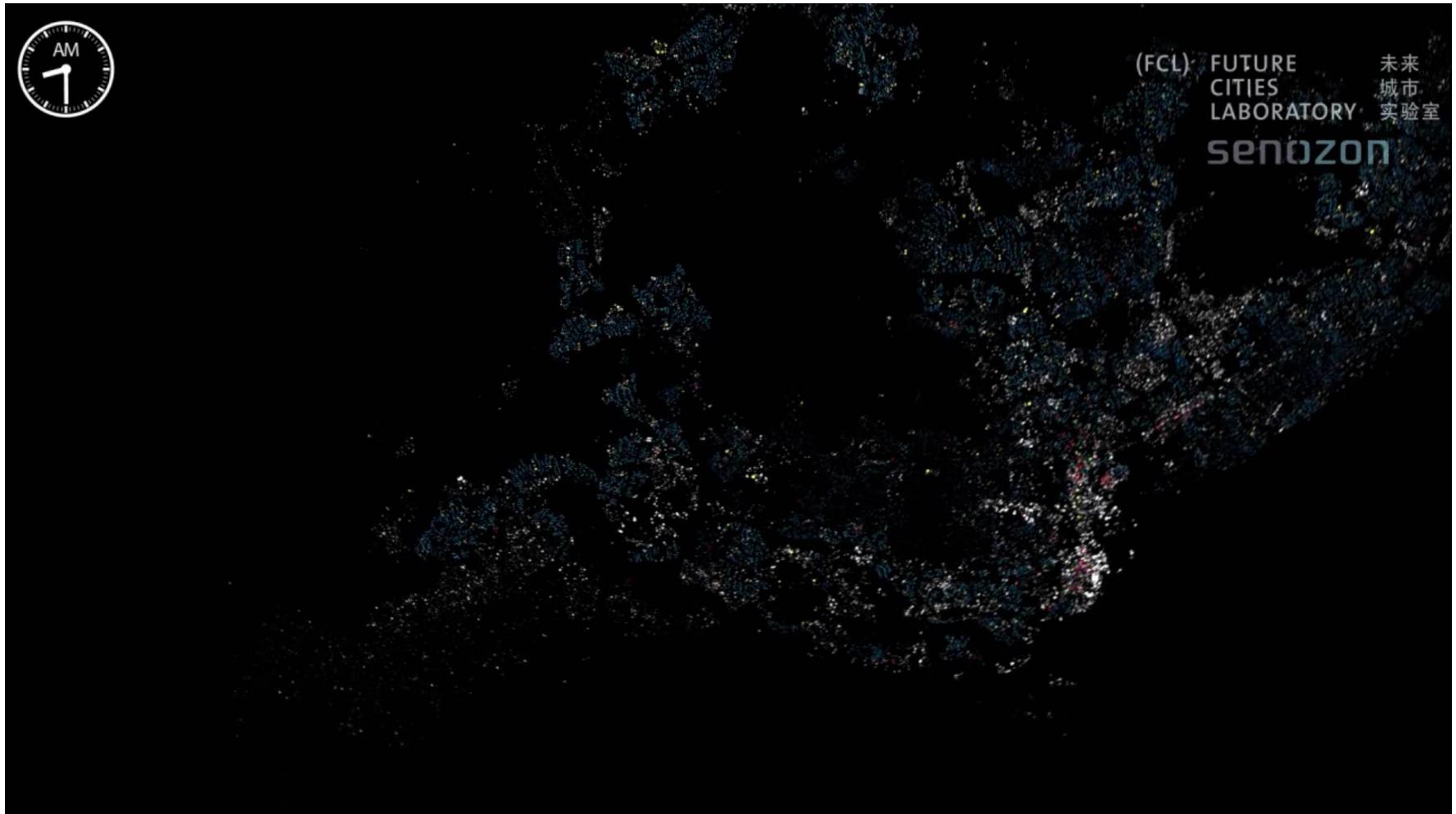
Kowald, M. and K.W. Axhausen (eds.) (2015)  
*Social networks and travel behaviour*,  
Ashgate

# Why the interest ?

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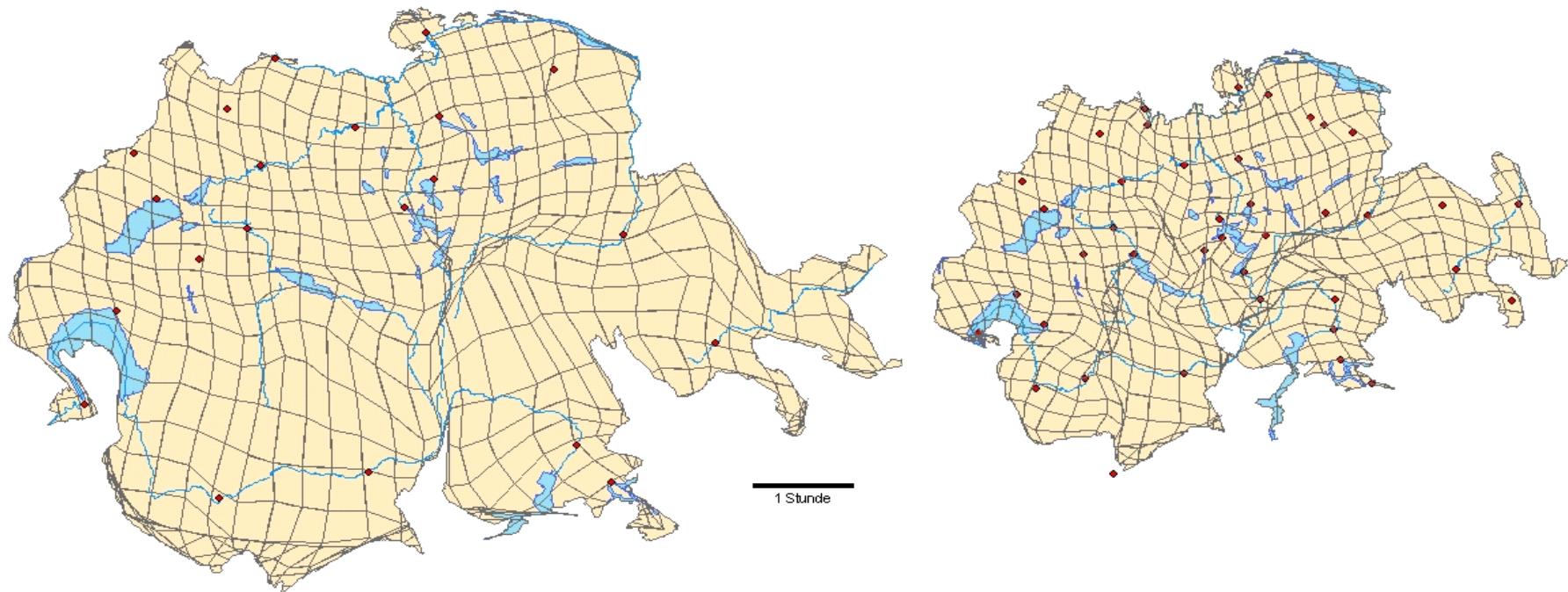
# An agent-based model of travel demand: e.g. Singapore

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# Road based – Switzerland 1950 and 2000

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# Long distance journeys (100km+) in Germany, 2010's

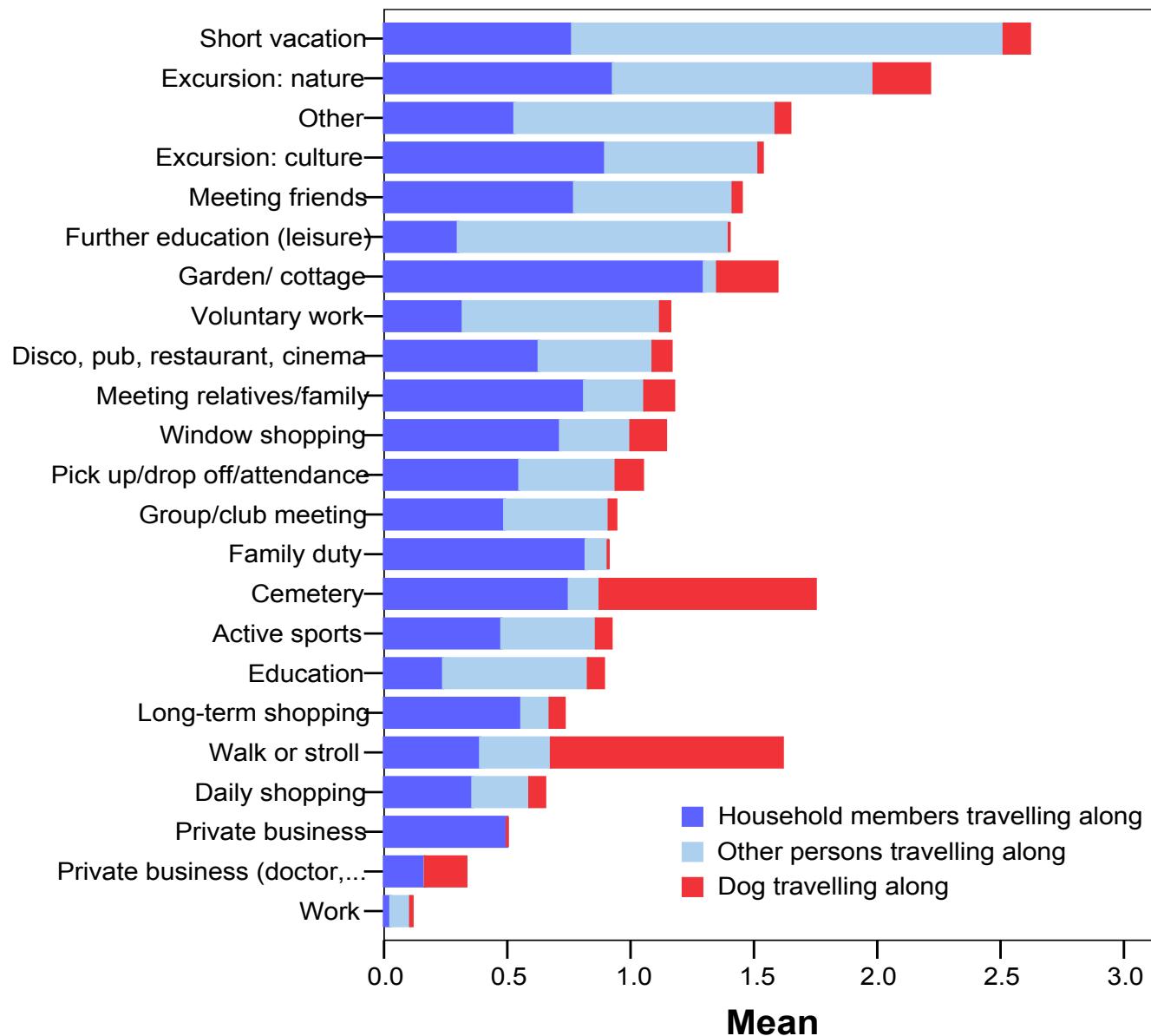
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Type	Number/year	km/journey
Vacation (5 days plus)	1.0	1600
Short vacation (2-4 days)	1.2	410
Other journeys with overnight stays	0.3	410
Day excursions	6.0	200
Business trip with overnight stay	1.2	500
Business trip without overnight stay	1.2	150
Long-distance commuting and other trips	5.0	150

# Why social networks in transport/spatial planning ?

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# Example: Number of accompanying travellers



# Example: Heterogeneity in choice

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Location choice

- WTP
- Taste
- Joint choice with family, friends, persons to meet
- Schedule constraints
- Social constraints

For mode choice in addition

- Luggage
- Company
- Weather
- Temperature

# Example: Residential location choice in Kt. Zürich

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Variable	Beta	t-Test
Rent/Income	-5.51	***
log(m2/head)	0.98	***
<b>Frequency weighted mean distance to friends</b>	<b>-8.16</b>	*
<b>Exponent (friends)</b>	<b>0.22</b>	**
Mean distance to work/school	-1.59	**
Exponent (distance to work)	0.37	**
Travel time to Bürkliplatz	0.02	**
log(transit accessibility) * "No car"	0.41	**
log(car accessibility) * "Car"	-0.30	**
Share of equally sized HH within 1 km	0.02	*
Population density within 1 km	0.01	**
Share of empty flats in municipality	-0.11	
N = 683, rho <sup>2</sup> = 0.2128; * > 0.1; ** > 0.05; *** > 0.01		

# Travel and social networks

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# Benchmarking the current state

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- Numbers of contacts
  - Distance distributions
  - Geographies
  - Frequency and mode of contact
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- “Productivity”
  - Levels of local anomie
  - Levels of local trust
  - Level of place attachment

# Empirical strategy

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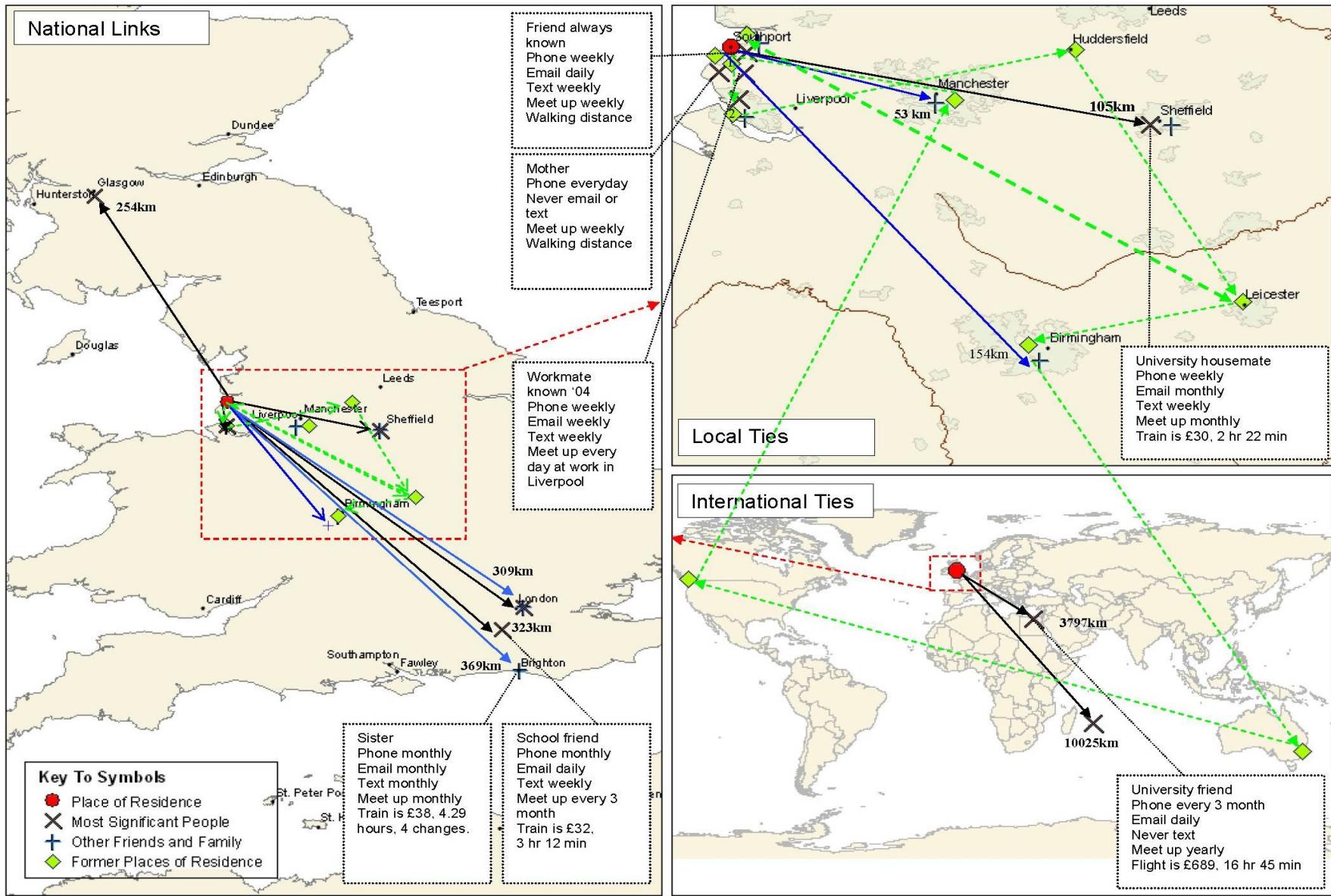
- Surveys of social geographies & mobility biographies
  - Egocentric
  - Snowball
- Travel diaries
  - One-Day
  - Multiple days
- With/without information about the presence of others
- With/without named co-travellers, co-present persons

# Social network surveys @ IVT

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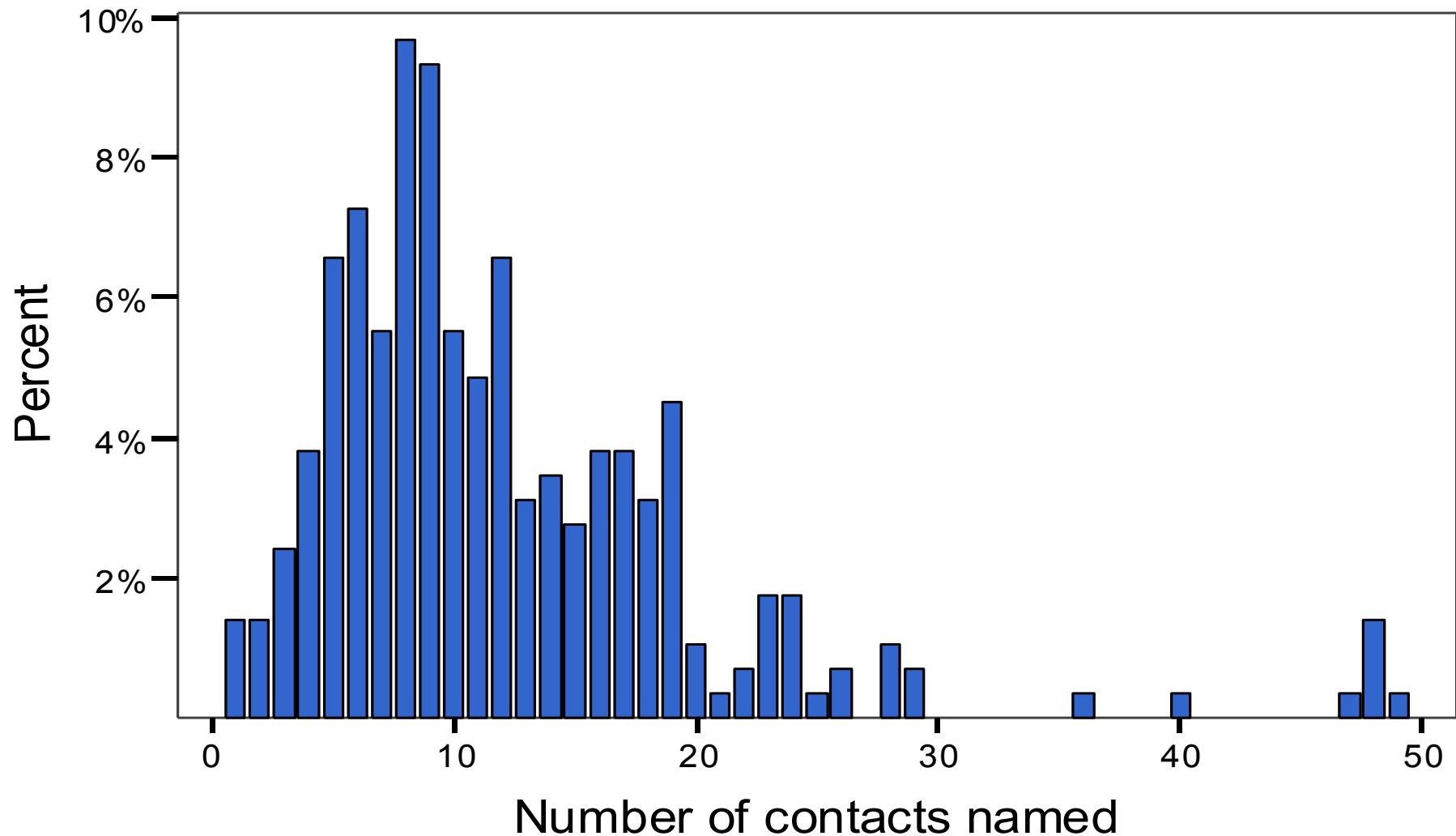
- Ohnmacht: 50 egos qualitative/quantitative in Zürich
- Larsen/Urry: 24 egos qualitative/quantitative in NE England
- Frei: 300 egos quantitative in Zürich
- Kowald: snowball; 750 egos quantitative worldwide (starting with 40 egos in Kanton Zürich)(12000 alters in total) (8 day diary included)
- Kowald/Diekmann: 2000 respondents of the Swiss Environment Survey – 5 core alters
- Sun: Smart card use on busses in Singapore

# Biography of an architect, about thirty



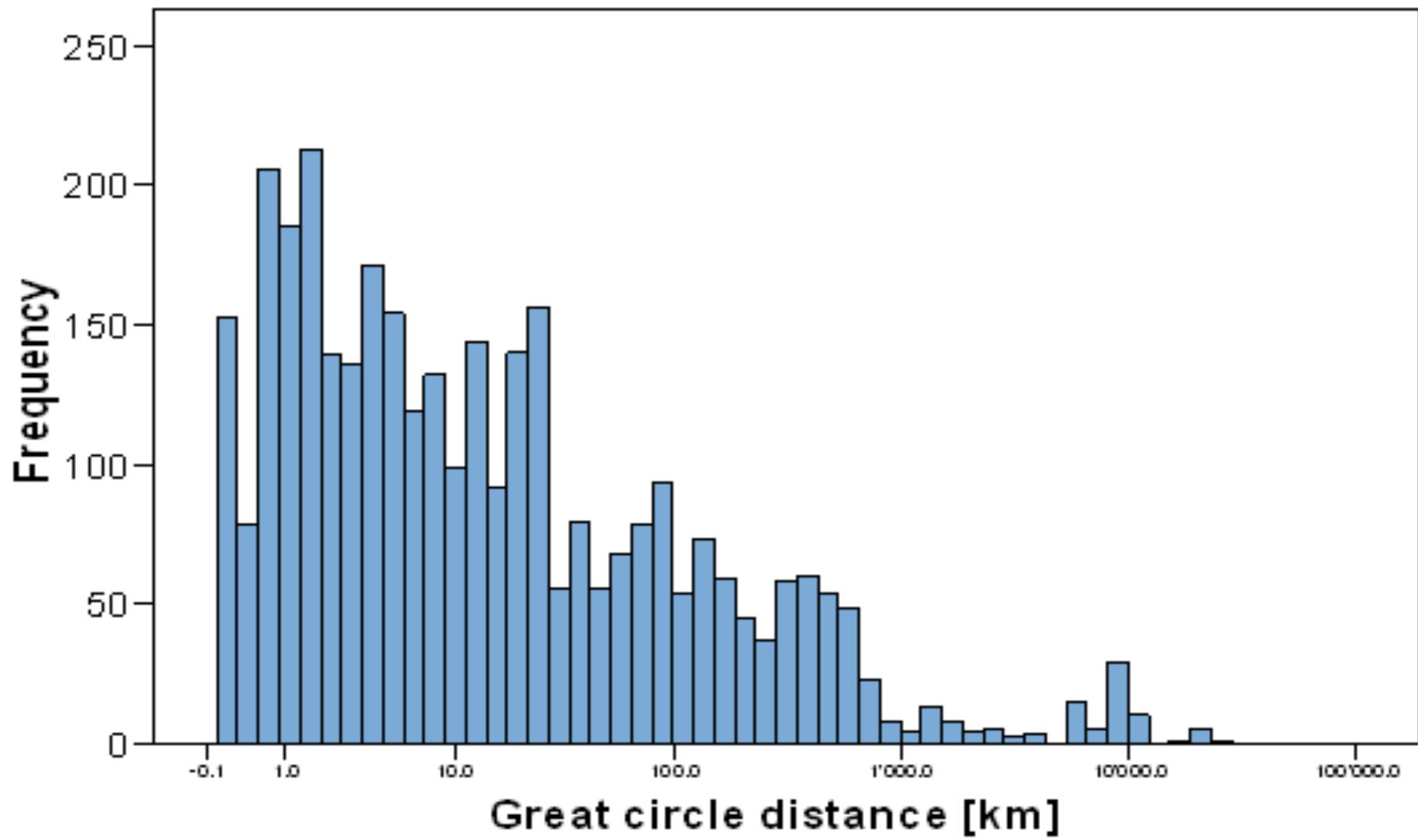
# Number of contacts reported

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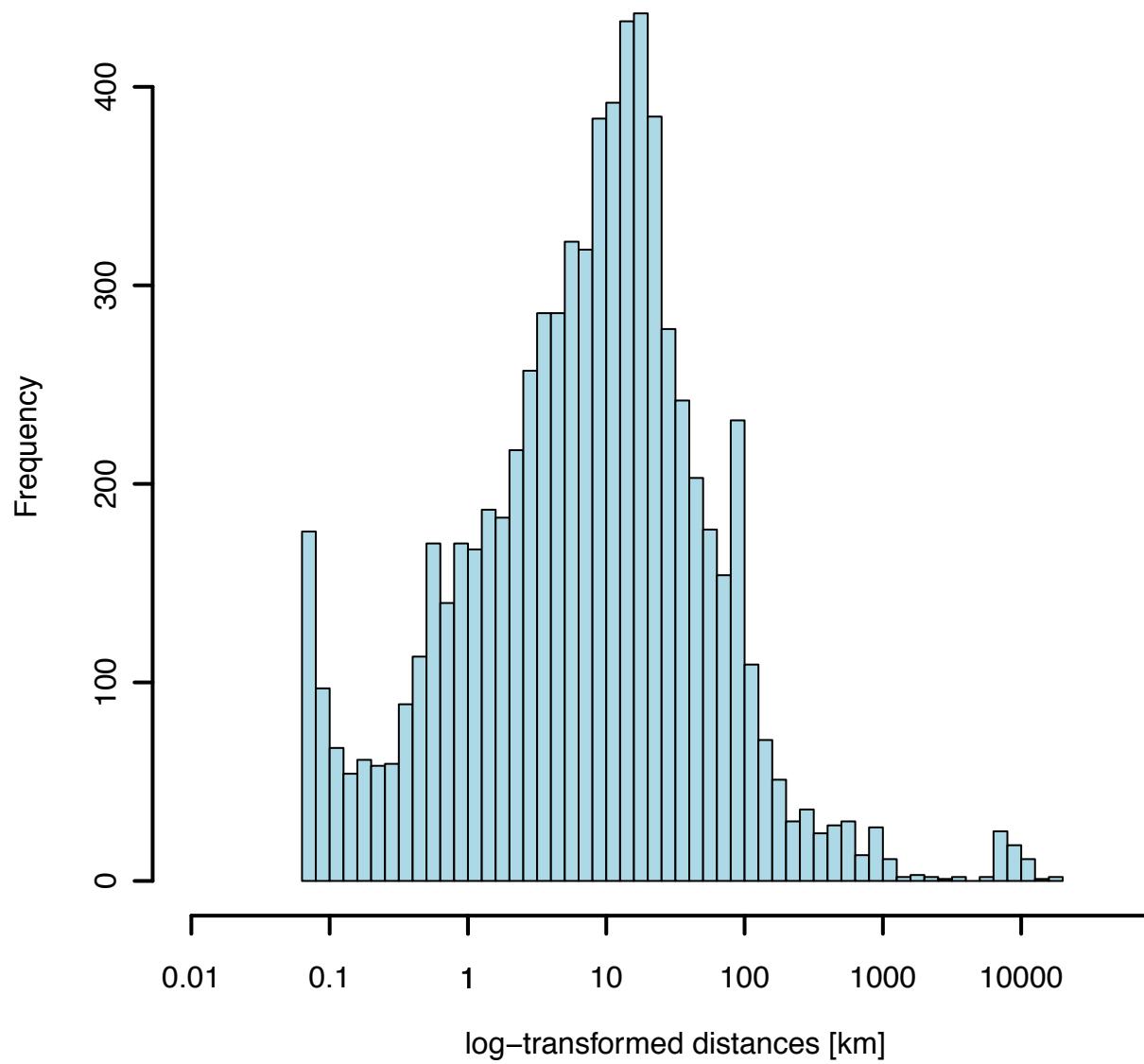
# Great circle distances between “leisure” contacts: Zürich

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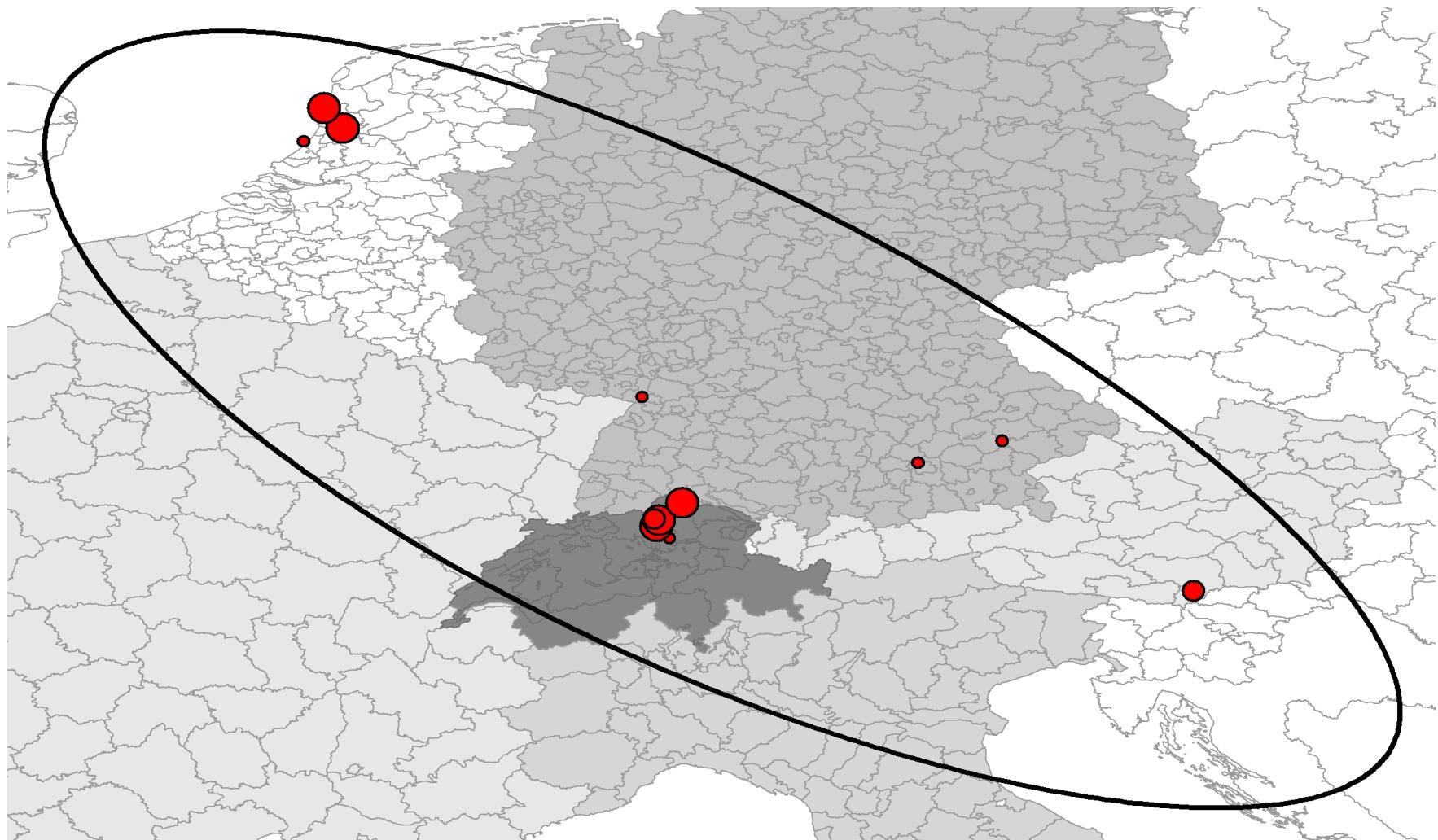
# Great circle distances between “leisure” contacts: Snowball

Daten: Schneeballbefragung IVT, Siehe Kowald et al. 2012



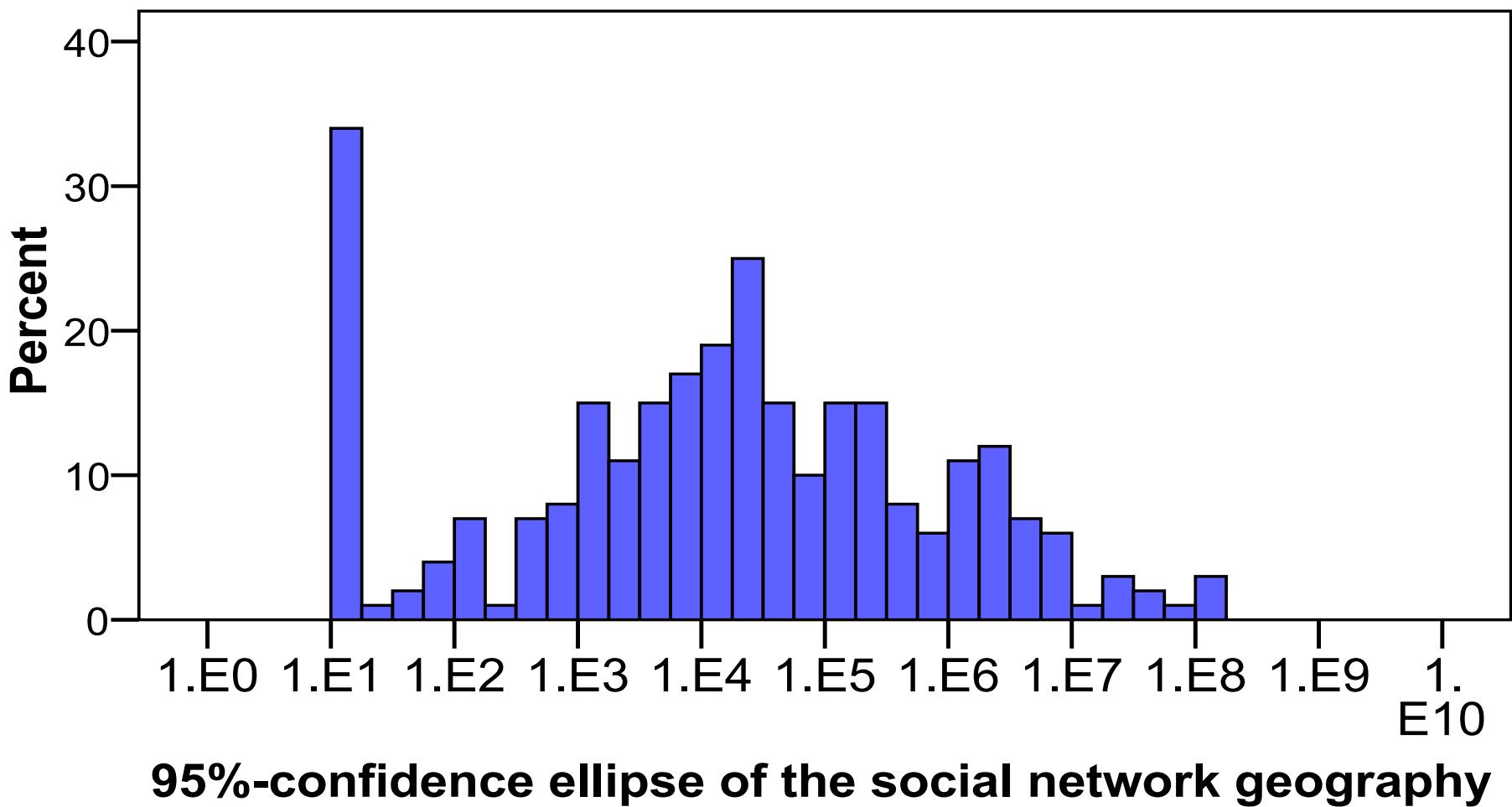
# Example of a social network geography

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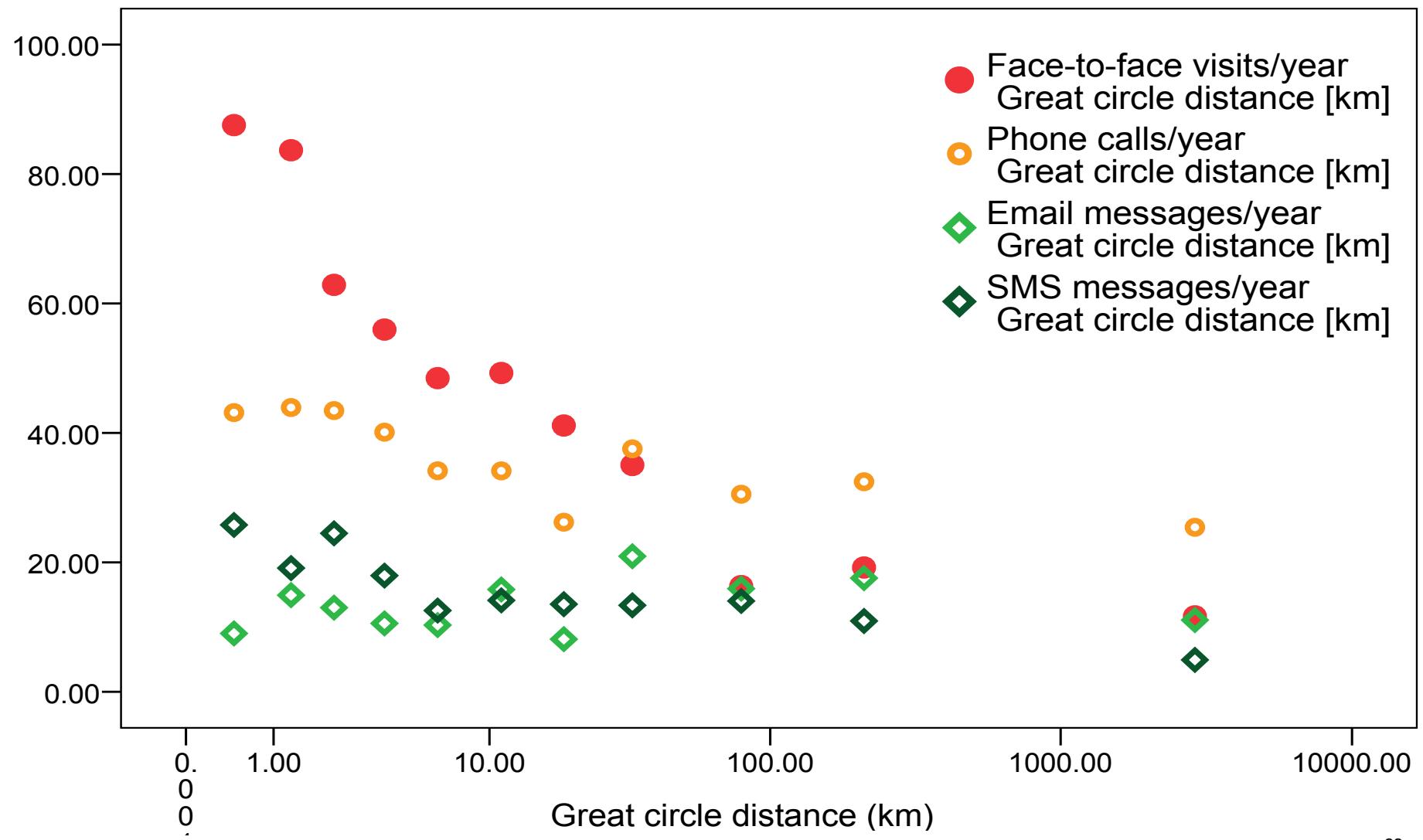


# Size of network geometries

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# Interactions by mode and distance between homes



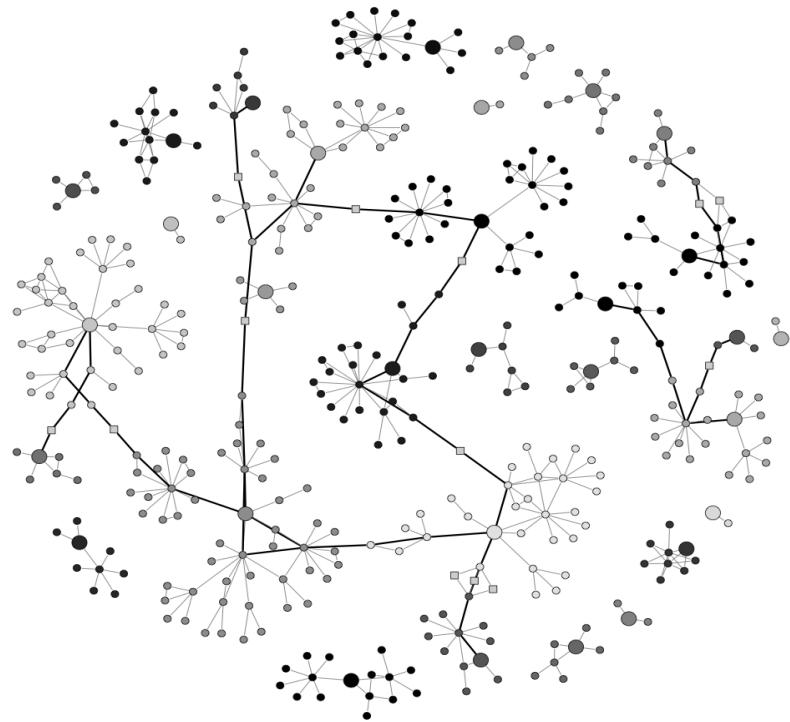
# 2010/11 Snowball survey

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# Behind egos' horizons: The connected 'snowball'-graph

Kowald and Axhausen, 2011

- Seed
- Ego
- Bridging alter



	Vertices	Edges	Density	Components	Triangles
Without sociogram	6'584	7'349	0.000	19	0.017
With sociogram	6'584	32'671	0.002	19	0.518

# Comparisons

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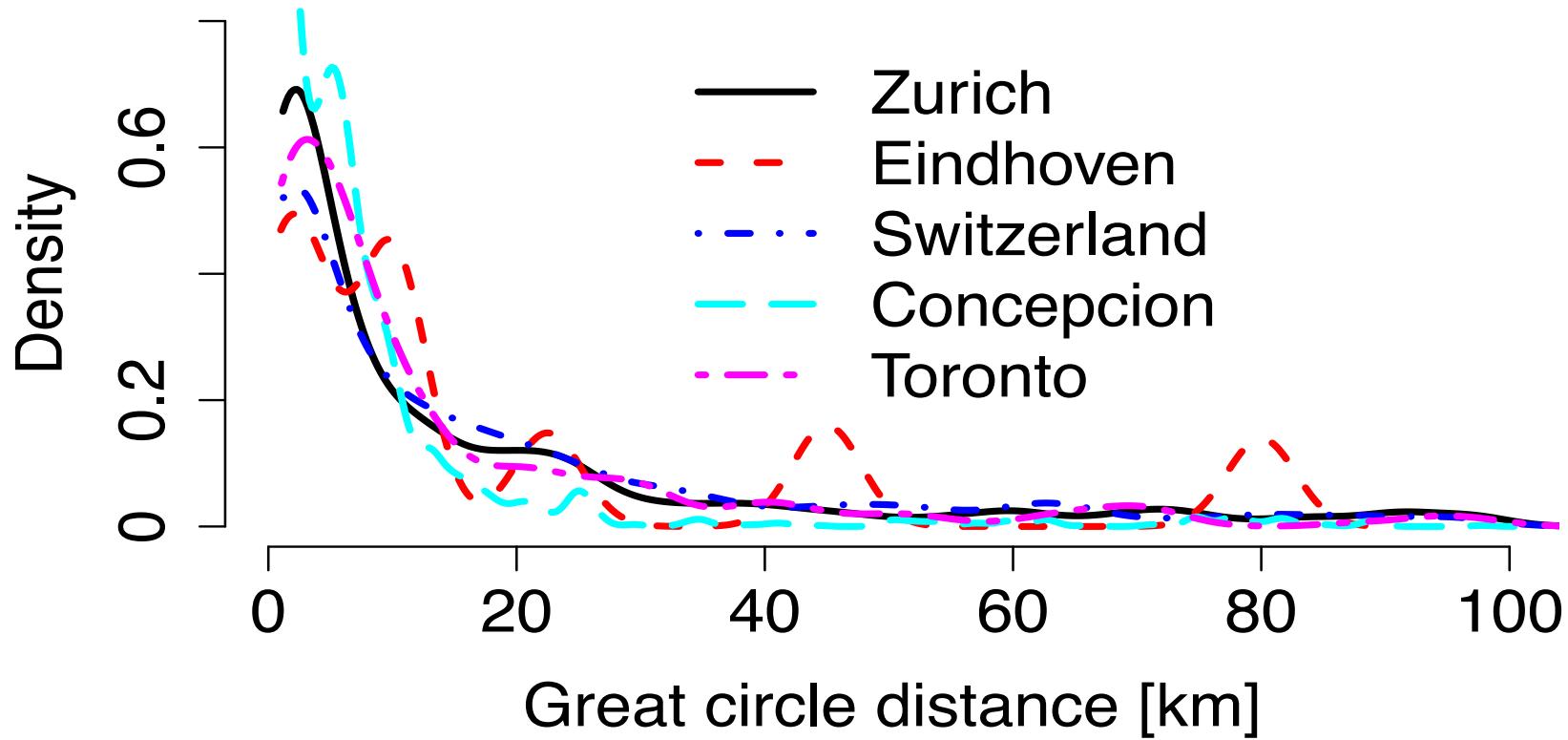
# Transport motivated social network surveys

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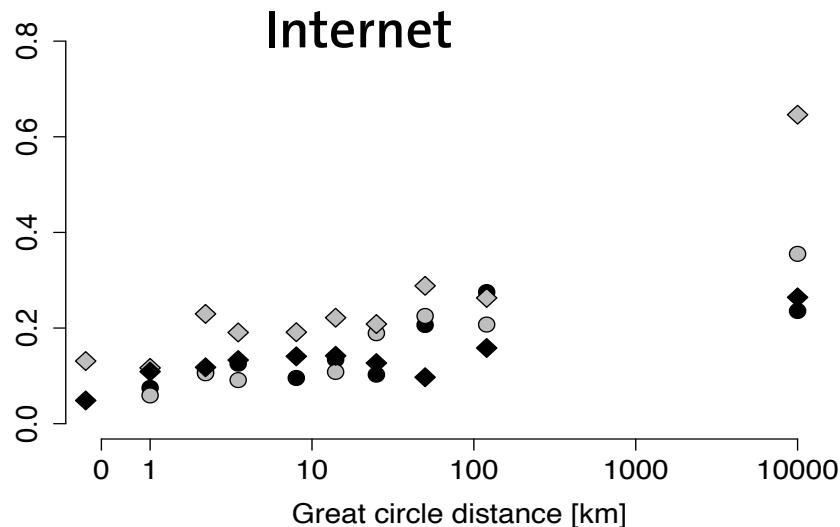
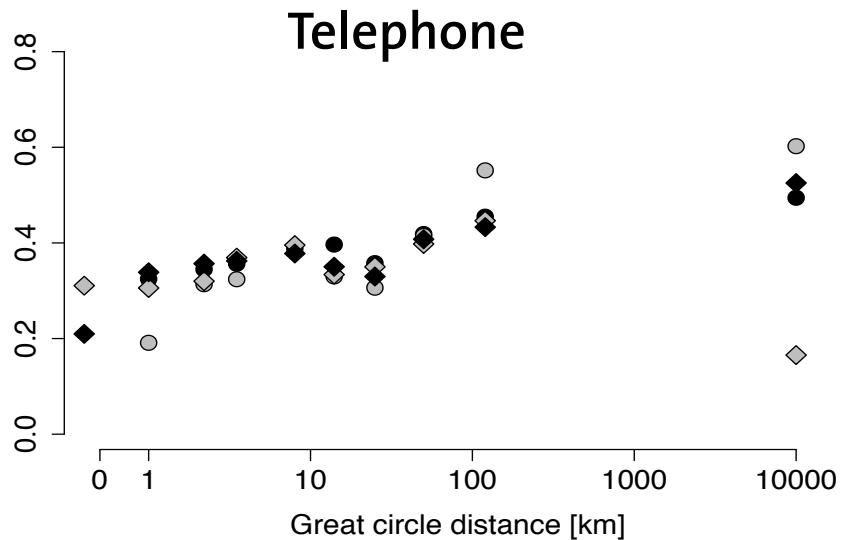
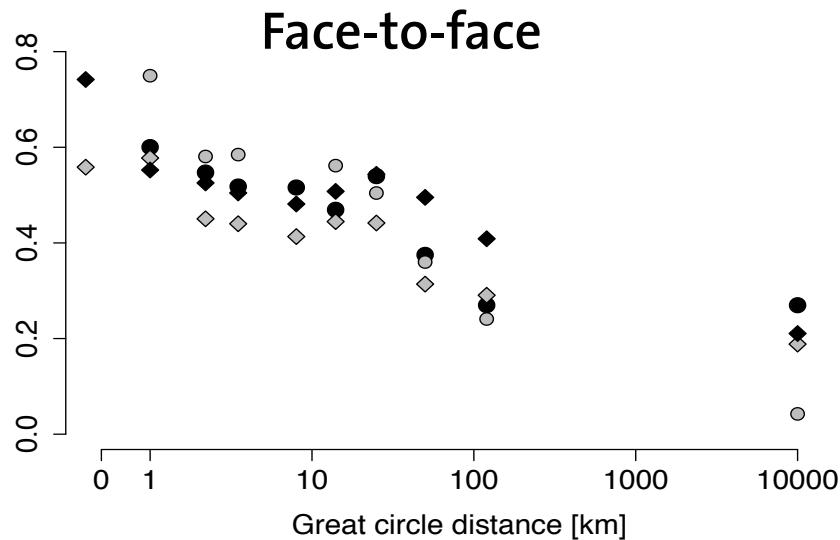
- East York, Ontario (Wellman, Carrasco et al.)
- Eindhoven, Netherlands (Arentze, Van der Berg)
- Concepcion, Chile (Carrasco)
- City of Zürich (Frei)
- Kanton Zürich snowball (Kowald)

# Contact “density” – shares by distance class

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# Shares of contact by mode

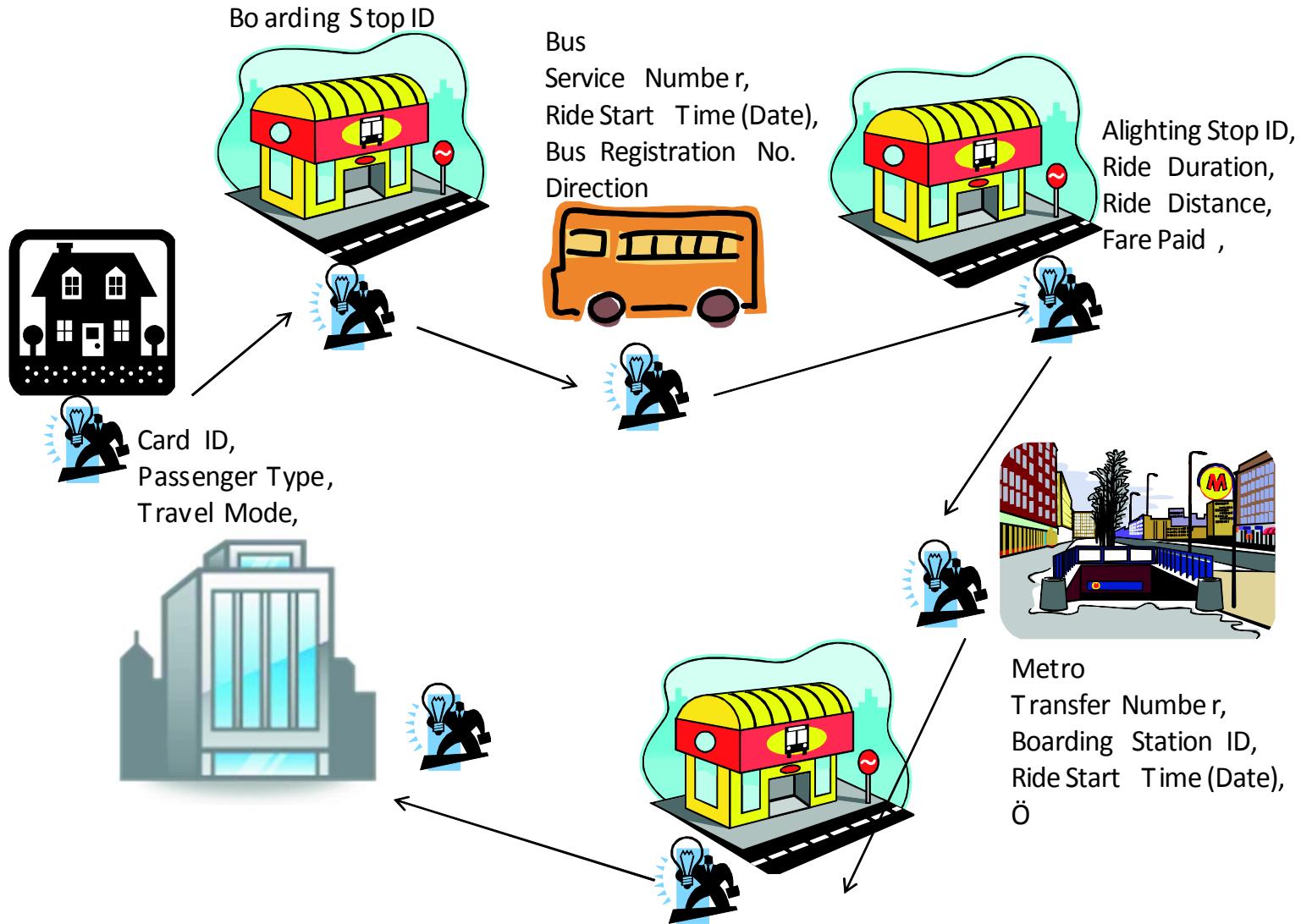


- Zurich
- Eindhoven
- ◇ Switzerland
- ◆ Concepcion

# Low level networks as a building block

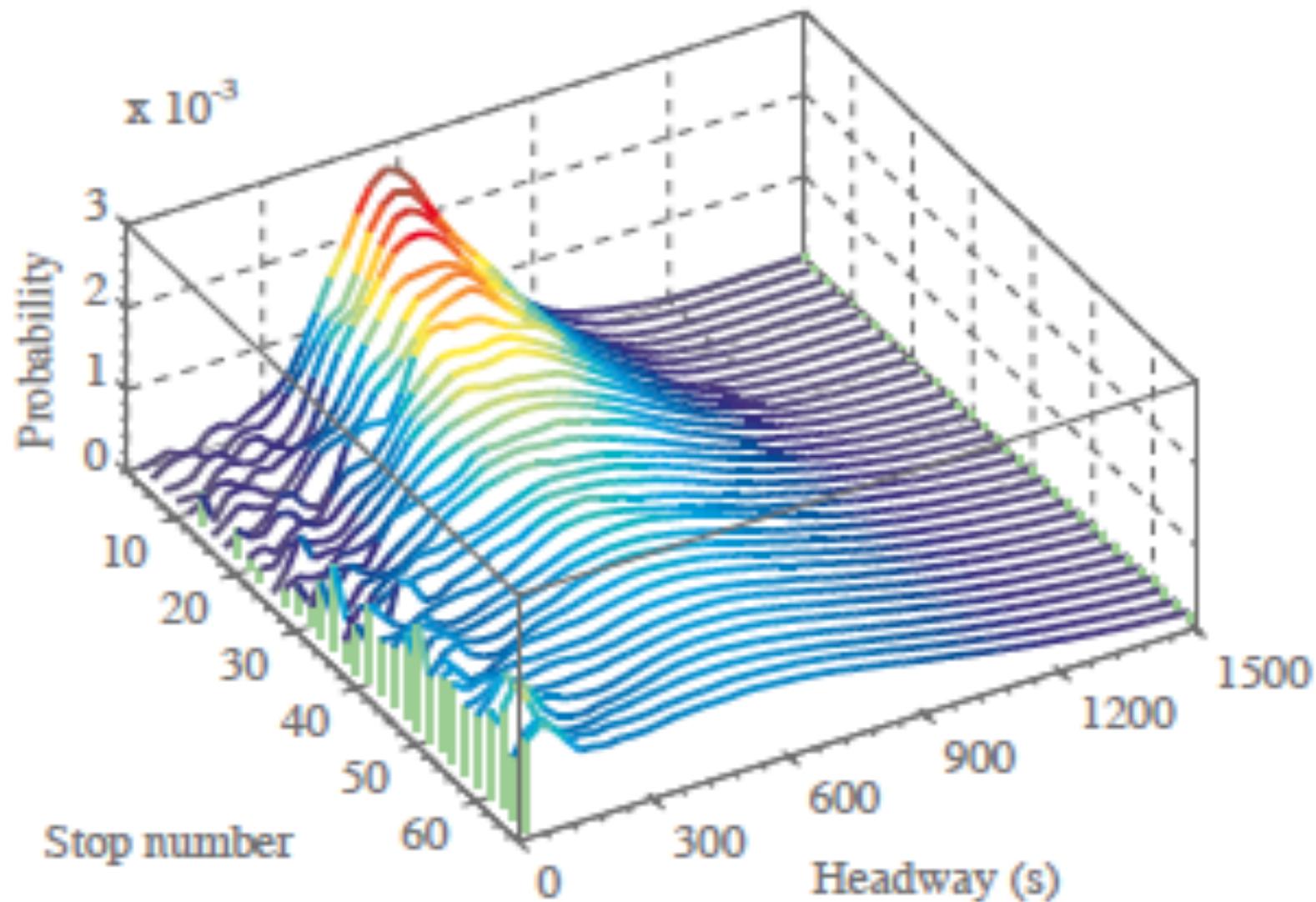
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# Smart card records as a source



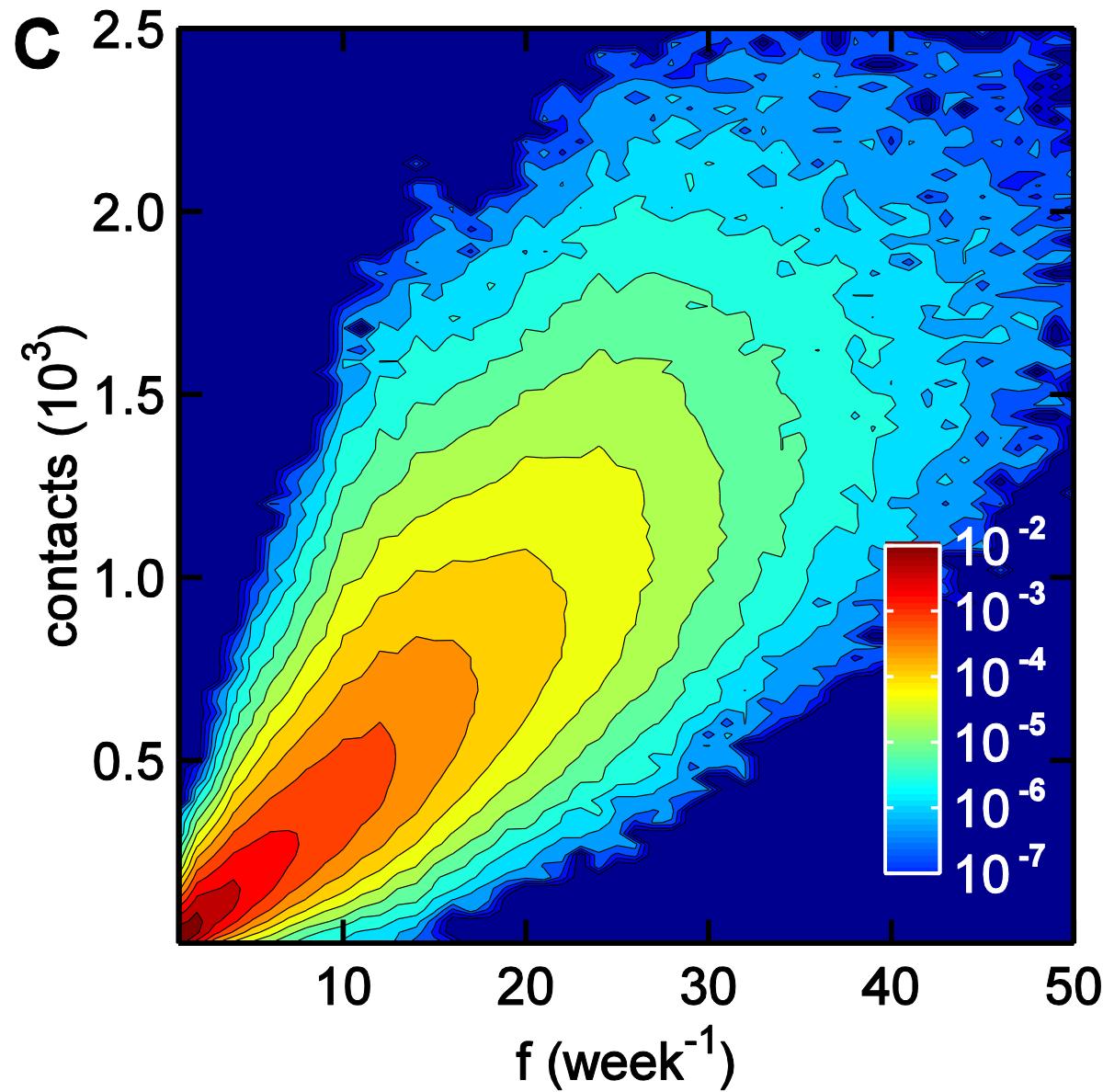
# Arrival distribution along a line

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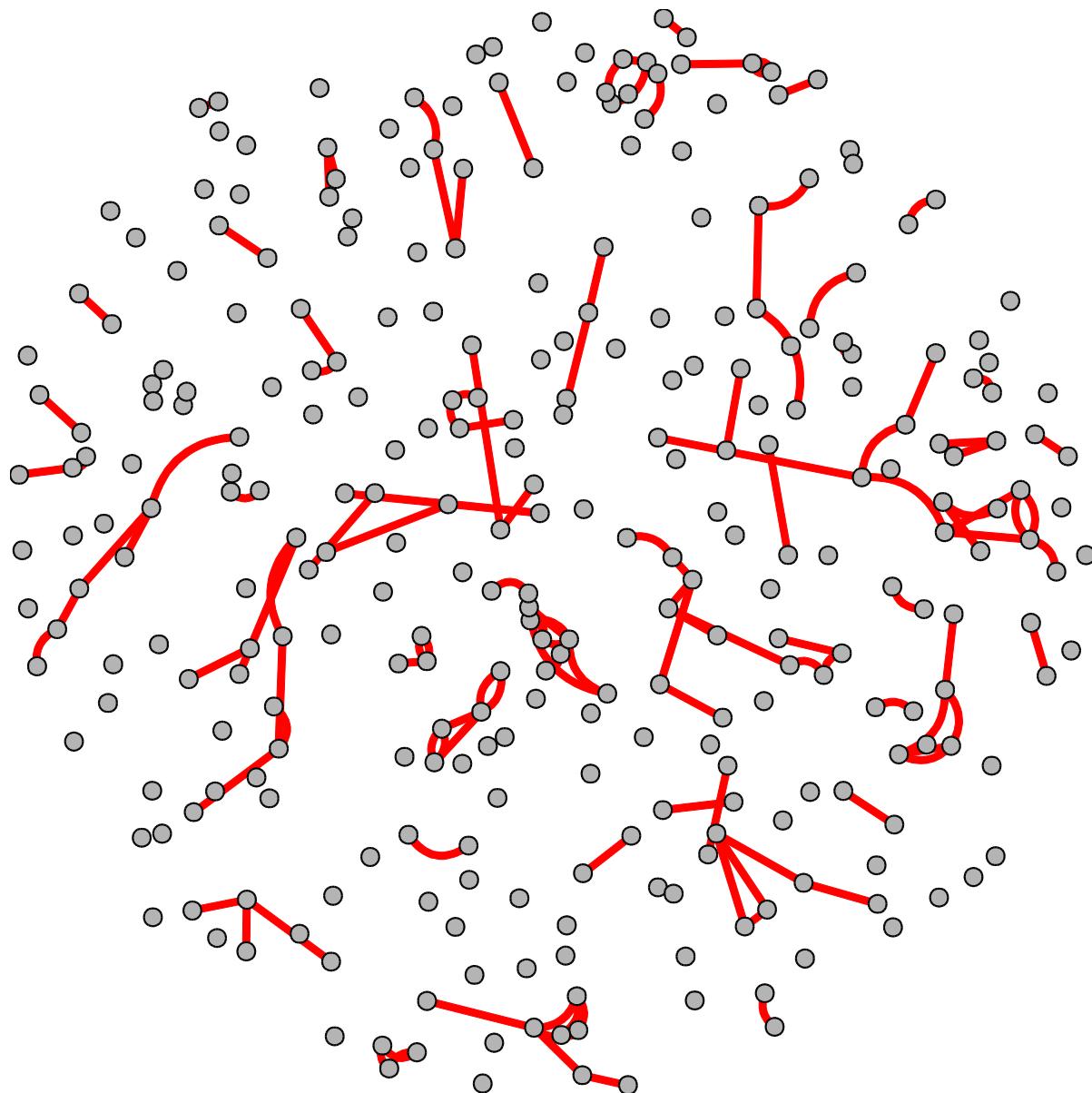
# Number of contacts versus usage frequency

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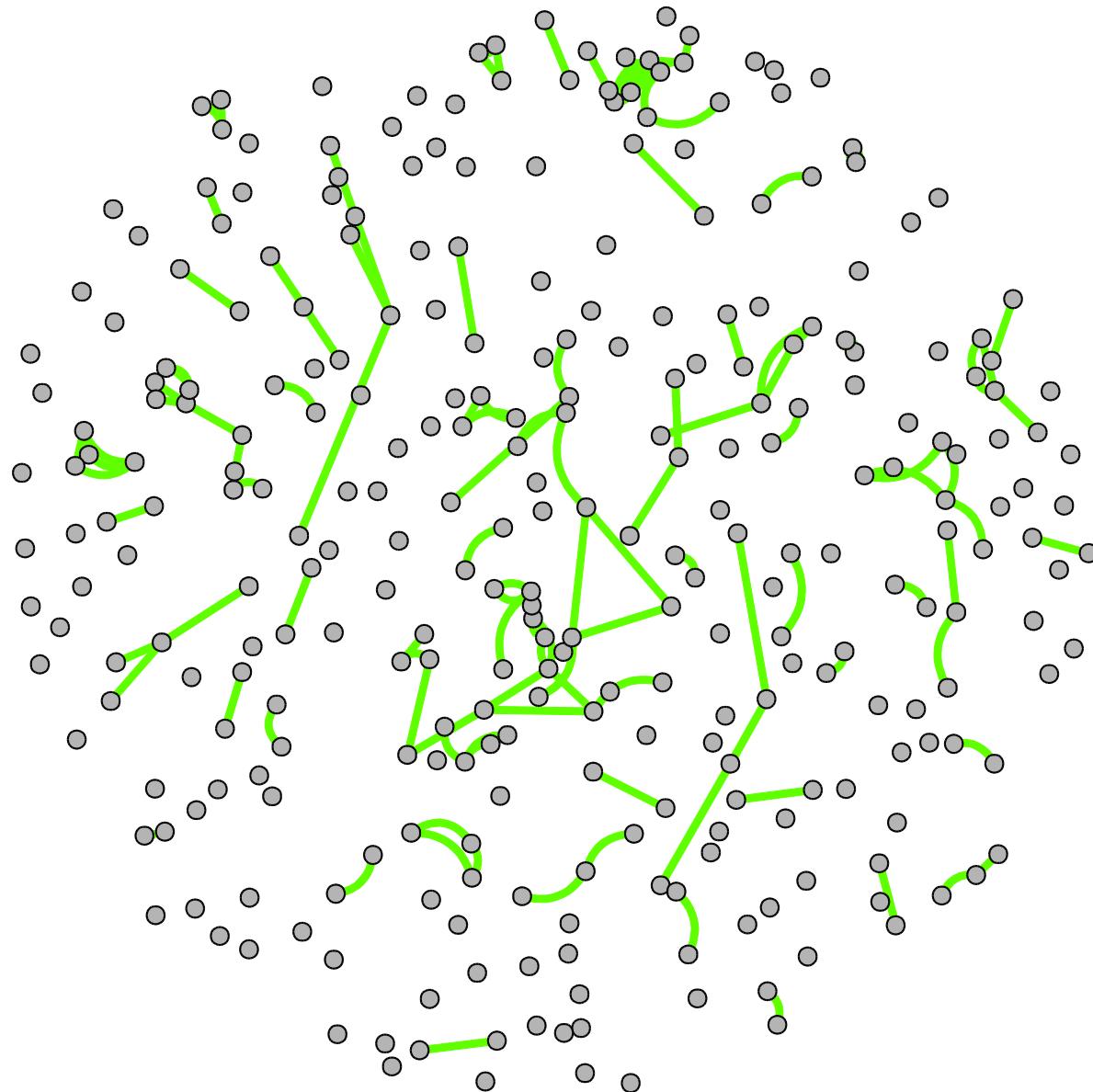
# Monday

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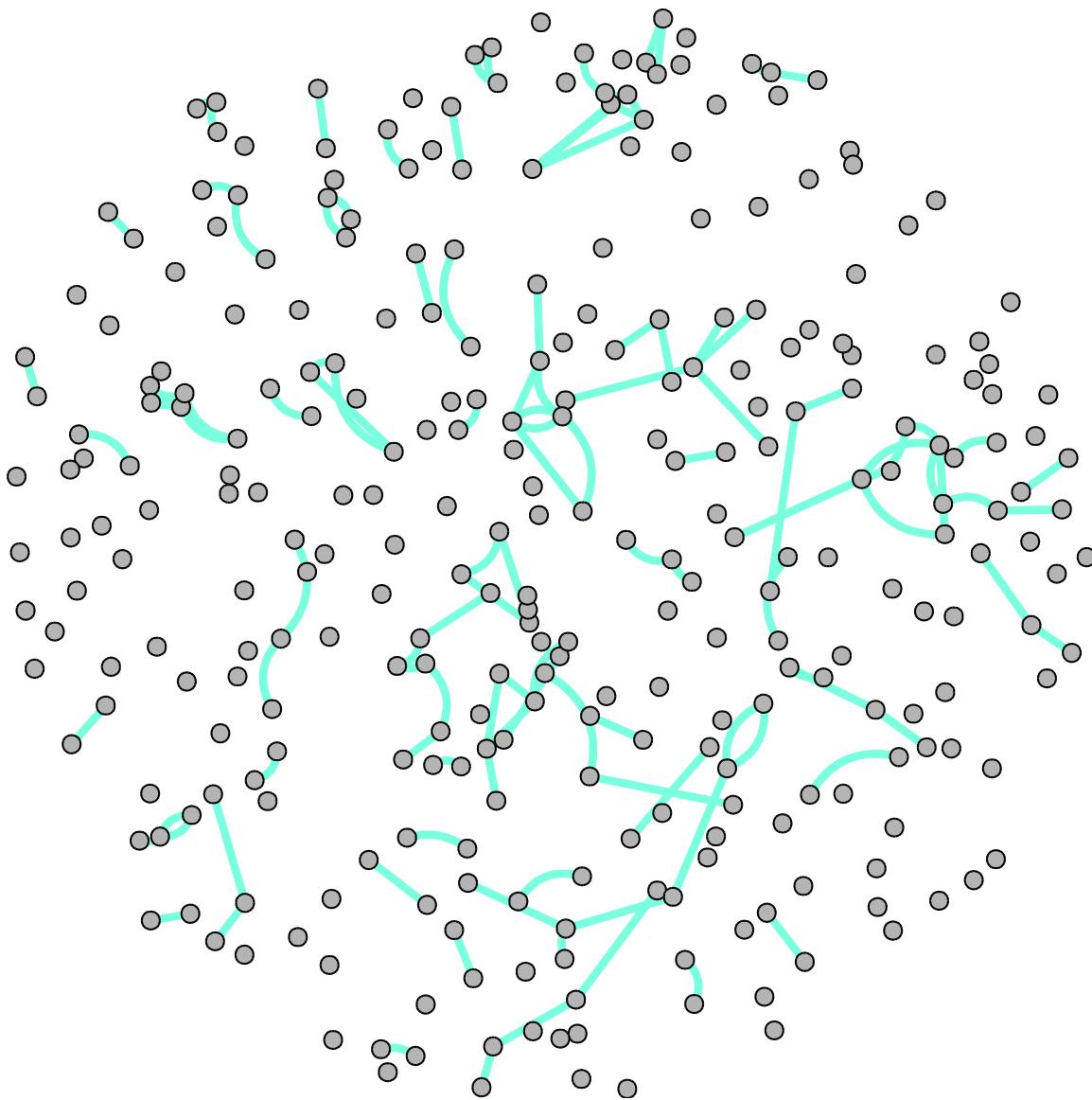
# Tuesday

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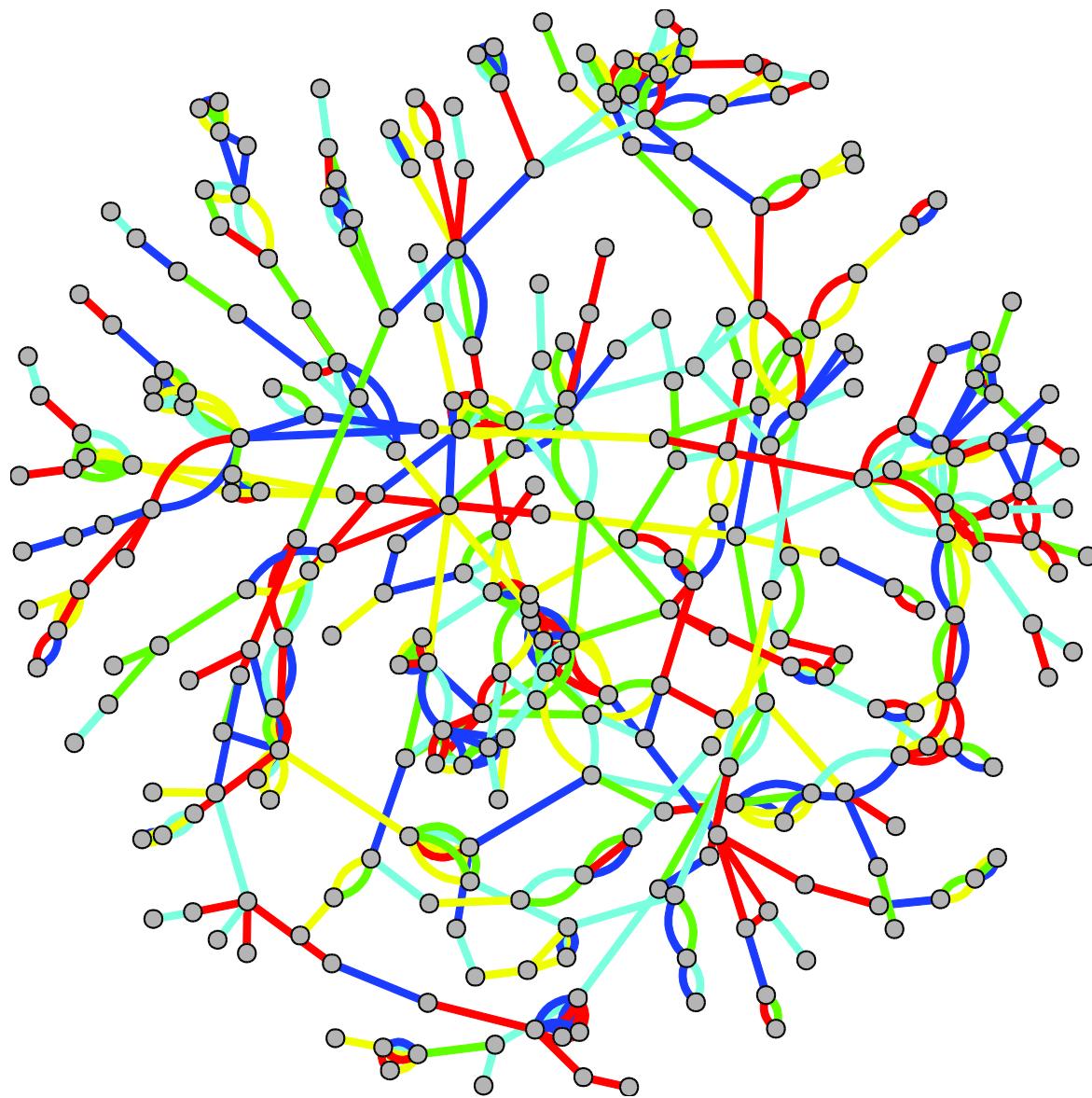
... Friday

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## ... the weekly summary

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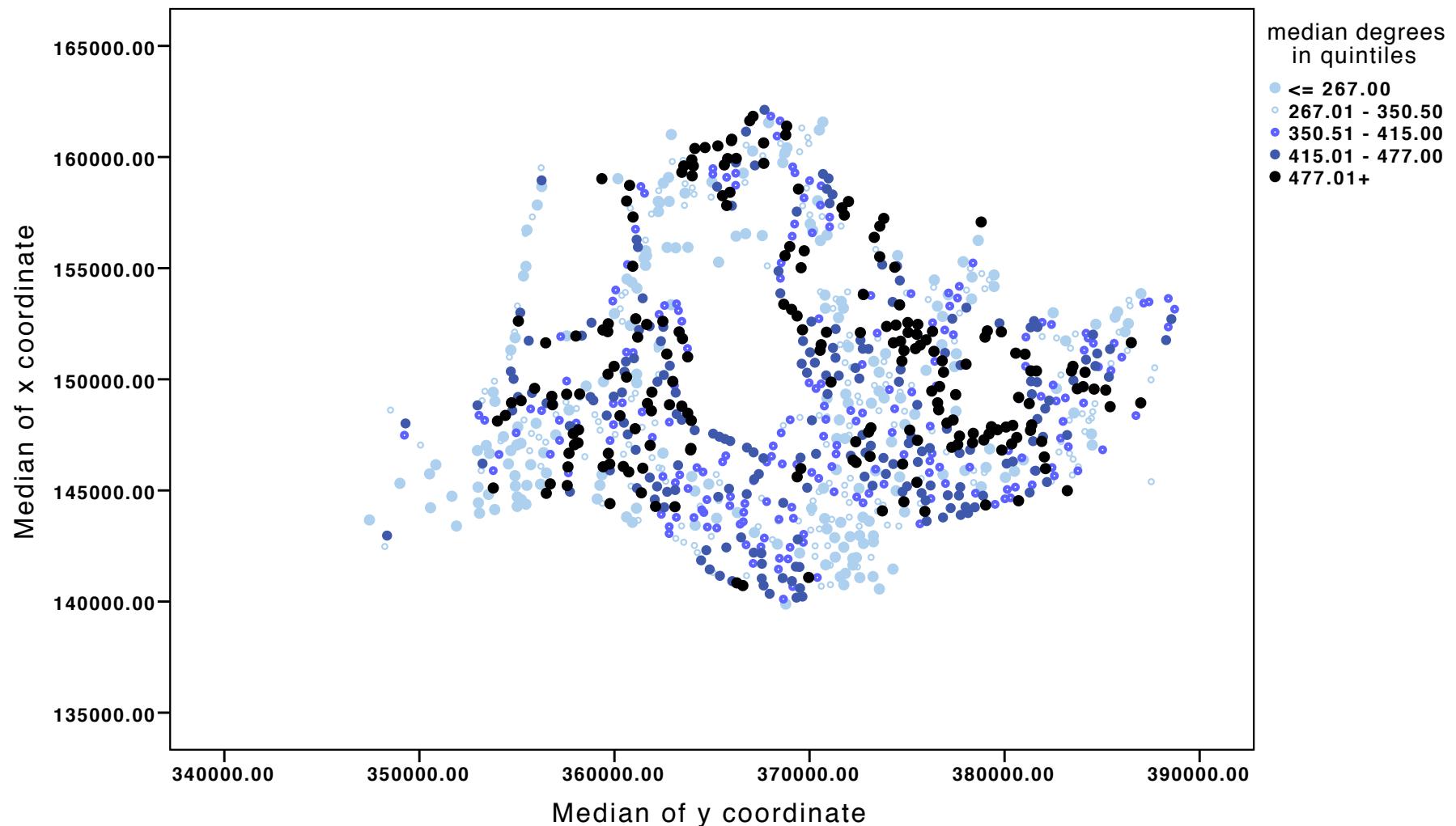
# A small world network in Singapore's busses

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- One component by Wednesday
- Diameter: 6
- Characteristic path length: 2.95
  - (random: 2.63)
- Average clustering coefficient: 0.19
  - (random:  $4.5 \times 10^{-4}$ )
- Small-world
  - Watts DJ & Strogatz SH (1998) Collective dynamics of 'small-world' networks. Nature 393:440-442.

# A small world network in Singapore's busses, but uneven

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# Integration

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# Integration and future work

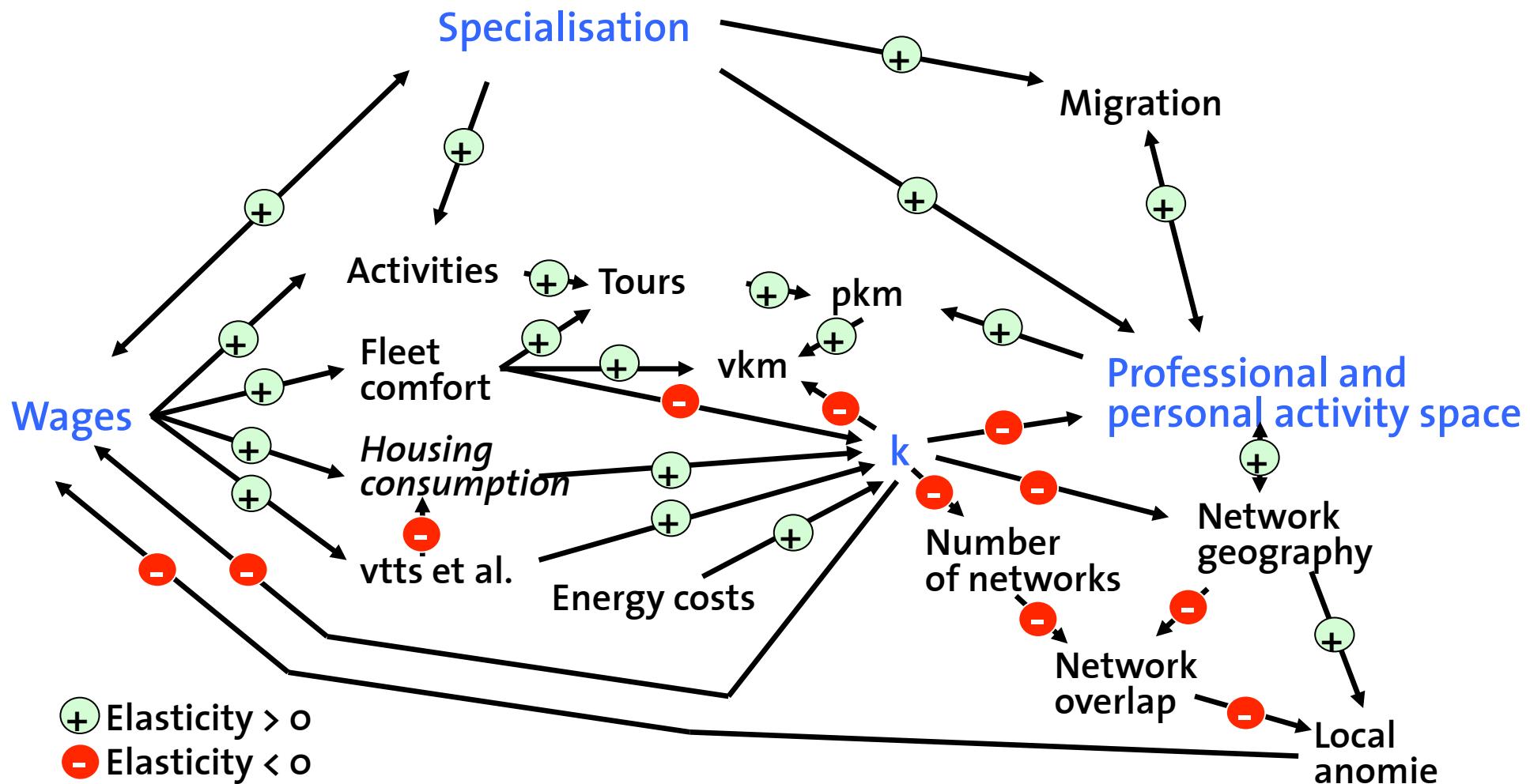
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- Generation of artificial social networks (Arentze et al., 2012) (degree, clustering, distances)
- Repeat of Switzerland Snowball
- Measurement of network size (leisure, work, civic engagement)
- Measurement of network dynamics (Timmerman's ERC project, Carrasco's Concepcion survey)
- Measurement of anomie, trust and social network geography
- Integration of network choice/decision making model (Dubernet)

# Integration, again

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# Some hypotheses for travel behaviour and more



## Questions ?

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**www.ivt.ethz.ch**

**www.matsim.org**

**www.futurecities.ethz.ch**

# Literature and references

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