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**Moving through nets:**

**The physical and social dimensions of travel**

10<sup>th</sup> International Conference on Travel Behaviour Research

Lucerne, 10-15. August 2003

# Homogenous groups of travellers

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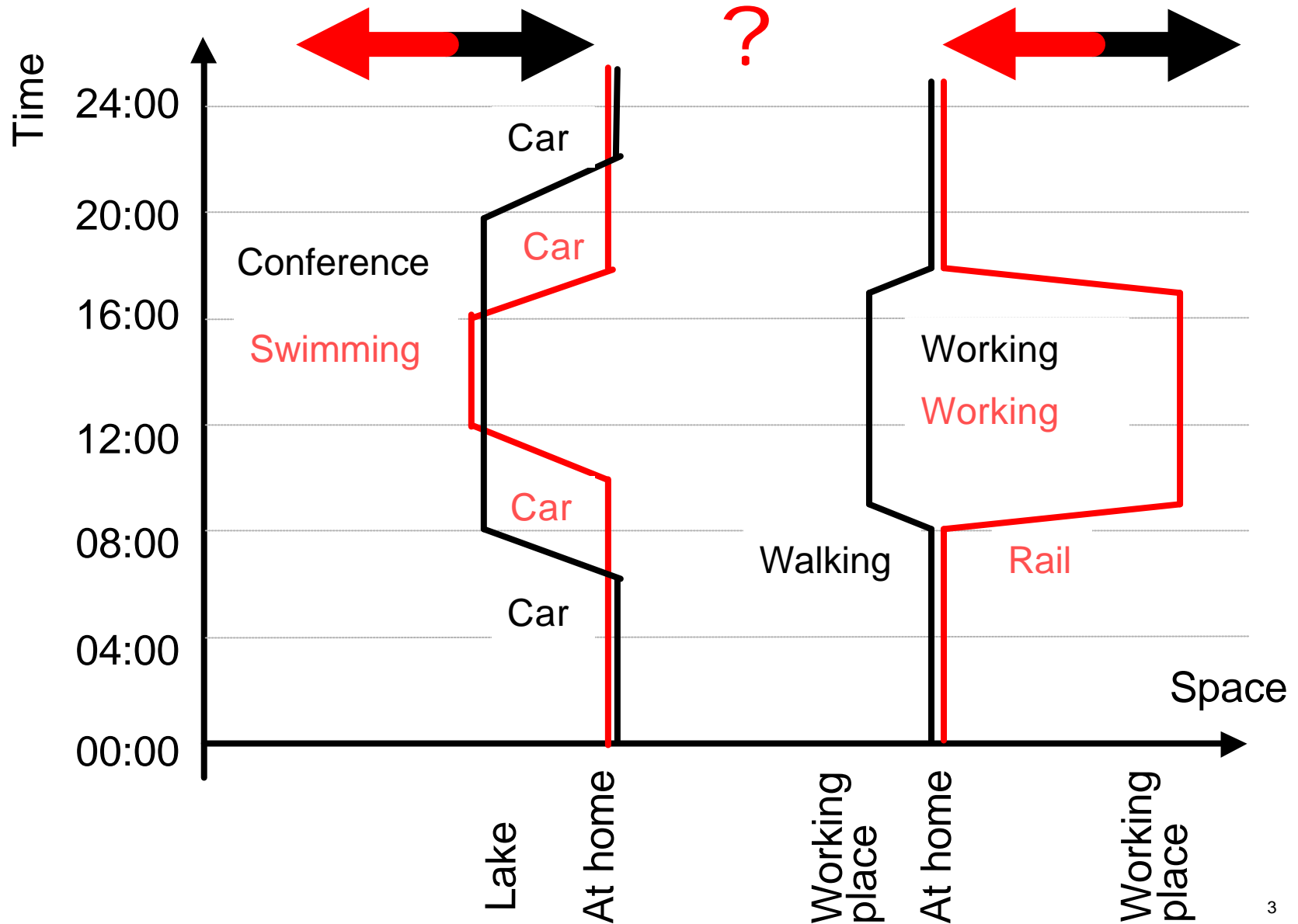
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# Measuring similarity



# Theory of sequence alignment I

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Measuring differences between two strings  $s [s_1, s_2, \dots, s_n]$  and

$g [g_1, g_2, \dots, g_n]$

$$d(s, g) = \sum_{i=1}^n f(x)$$

and  $f(x) = 1$  if  $s_i \neq g_i$   
 $f(x) = 0$  if  $s_i = g_i$

*Example:*

$s = \text{ABCDE}$

$g = \text{A} \color{red}{\text{F}} \text{BCDE}$

$d(s, g) = 4$



Problem of recognising sequential order or duration

# Theory of sequence alignment II: Levenshtein

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Similarity as total amount of effort to equalise  $s[s_1, s_2, \dots, s_n]$  and  $g[g_1, g_2, \dots, g_n]$

Four basic operation:

- Identity:  $w_e(s_i, g_i) = 0$
- Insertion:  $w_i(\mathcal{A}, g_i) = 1$
- Deletion:  $w_d(s_i, \mathcal{A}) = 1$
- Substitution:  $w_s(s_i, g_i) = w_d(s_i, g_i) + w_i(s_i, g_i) = 2$

Definition Levenshtein Distance:

Smallest sum of operation weighting values required to change  $s[s_1, s_2, \dots, s_n]$  into  $g[g_1, g_2, \dots, g_n]$

# Theory of sequence alignment III: Trajectories

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- Different possibilities to equal two strings
- Combination of operations are called trajectories

*Example*

$s$ =CAMBRIDGE

$g$ =CAMPING

1) substitute  $s_4(B:P)$ ,  $s_5(R:I)$ ,  $s_6(I:N)$ ,  $s_7(D:G)$  delete  $s_8(G)$ ,  
 $s_9(E) \Rightarrow d=10$

2) substitute  $s_4(B:P)$ , delete  $s_5(R)$ , substitute  $s_6(D:N)$ , delete  $s_8$   
(E)  $\Rightarrow d=6$

# Theory of sequence alignment IV: Problems

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Different attributes of a trip are semi-dependent

- easiest possibility: Sum of „unidimensional“ sequence alignments across all attribute, not appropriate
- most exhaustive: calculate all possible trajectories across all attributes, not possible due to problems with computing times
- compromise: Optimum trajectory based sequence alignment (OT MDSAM) (Joh et al. 1999)

# Software

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Dana (C.H. Joh)

- Multidimensional
- Restricted number of allowed elements per string
- Restricted possibilities to change operation weights

ClustalG (C. Wilson, A. Harvey, and J. Thompson)

- Unidimensional
- Large strings allowed
- Better possibilities to change operation weights

Optimize, TDA



# Dataset Mobidrive

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- Reporting period: Six weeks
- Travel diary, weekly send out, mailed back and checked via phone
- Cities of Karlsruhe und Halle/Germany
- 162 households, 361 persons
- ca. 52.000 trips and 15.000 days reported September - November 1999 (Pretest: May-July 1999)

# Comparison 1: Persons

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Dimension	Variables chosen
Trip purpose	Share of leisure, school, work, shopping [%]
Timing	Share of trips in the morning [%] Share of trips at weekends [%]
Duration	Mean duration / trip[min]
Distance	Mean distance / trip[min]
Trip Mode	Share non-motorised, public transport, private motorised transport [%]
Frequency of trips and immobile days	Number trips/ day [N] Share of immobile days [%]
Intrapersonal variability	Levenshtein distance
Coupling constraints	Number of accompanying persons [N]

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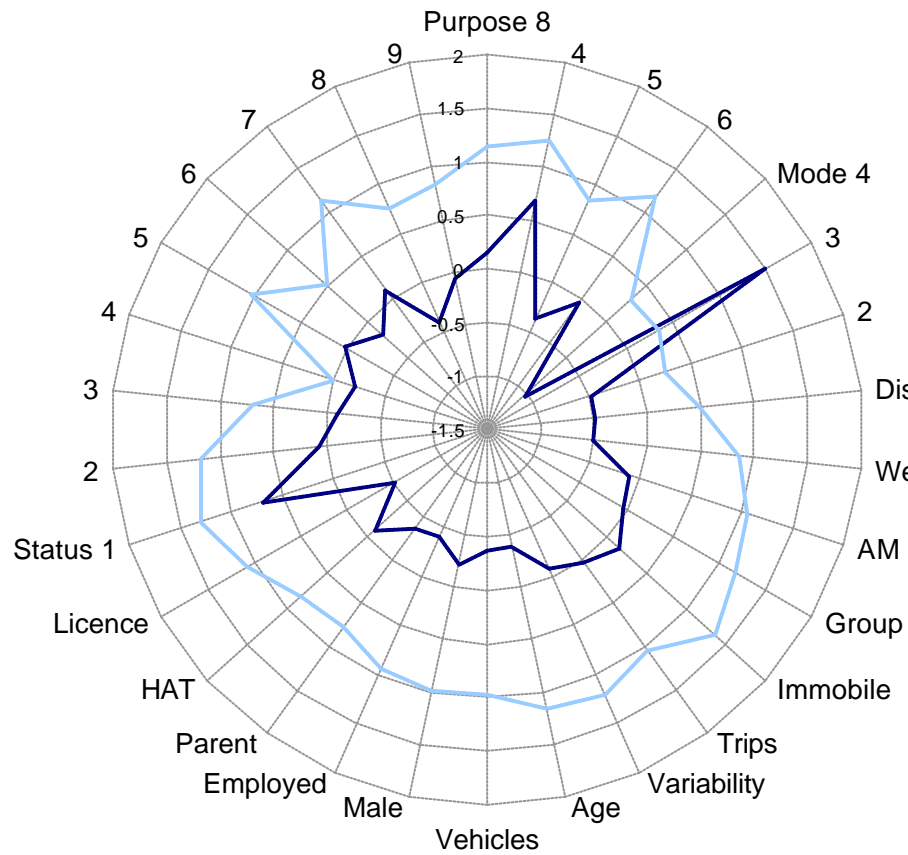
## Comparison 2: Random days

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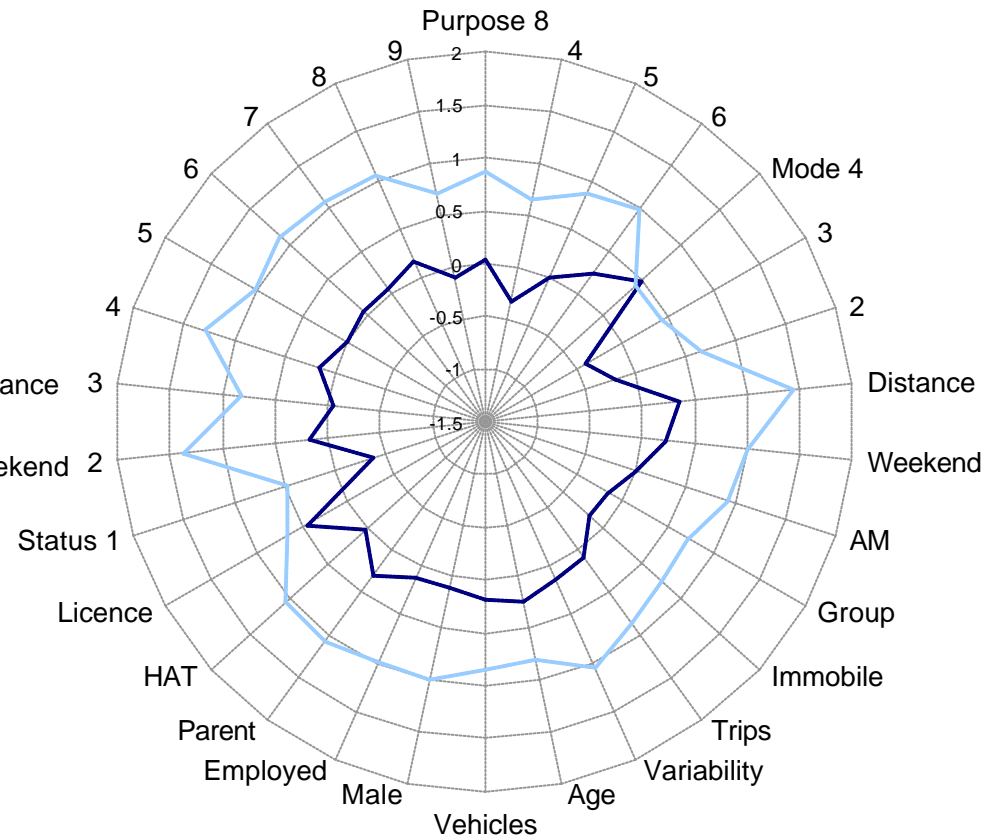
Problem of OT MDSAM between all days: Computing time

- about 15200 days in Mobidrive; 115 million comparisons
- 170 comparisons: 1 Minute
- total computing time for comparing all days: 15 months
  
- Initial compromise: one random (week)day per person
- SQA used for inter-personal comparisons

# Examples: Clusters for person-attribute matrix

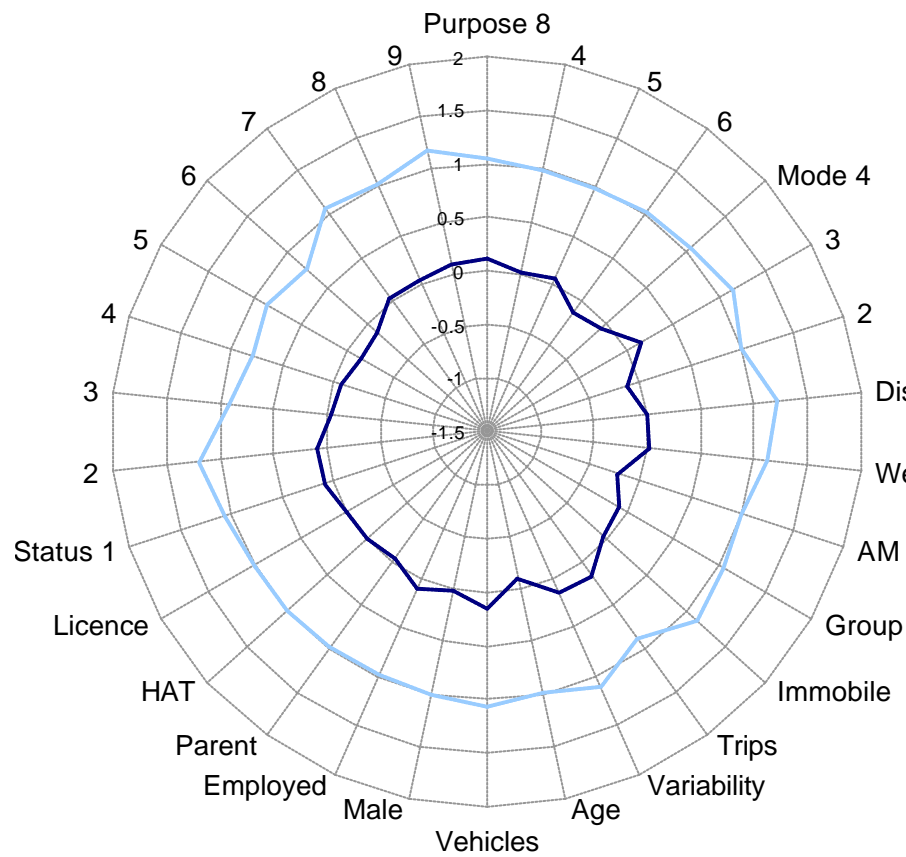


Cluster 3

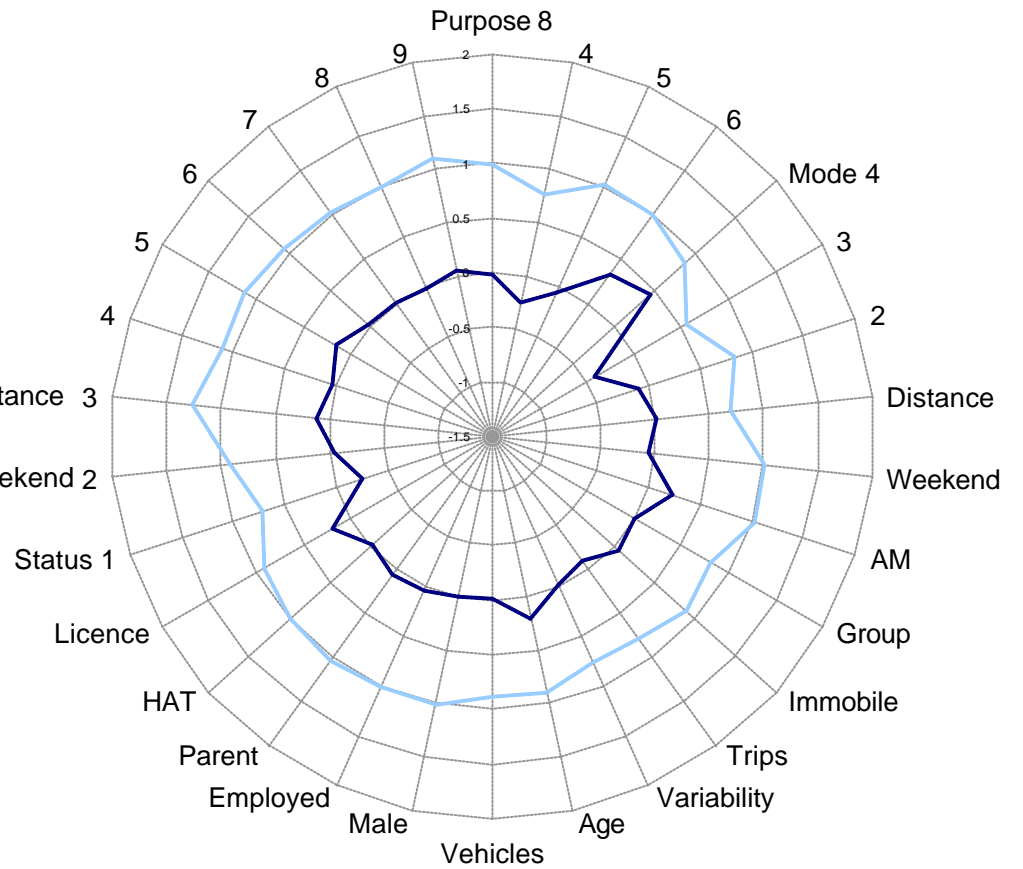


Cluster 4

# Examples: Clusters for random days matrix

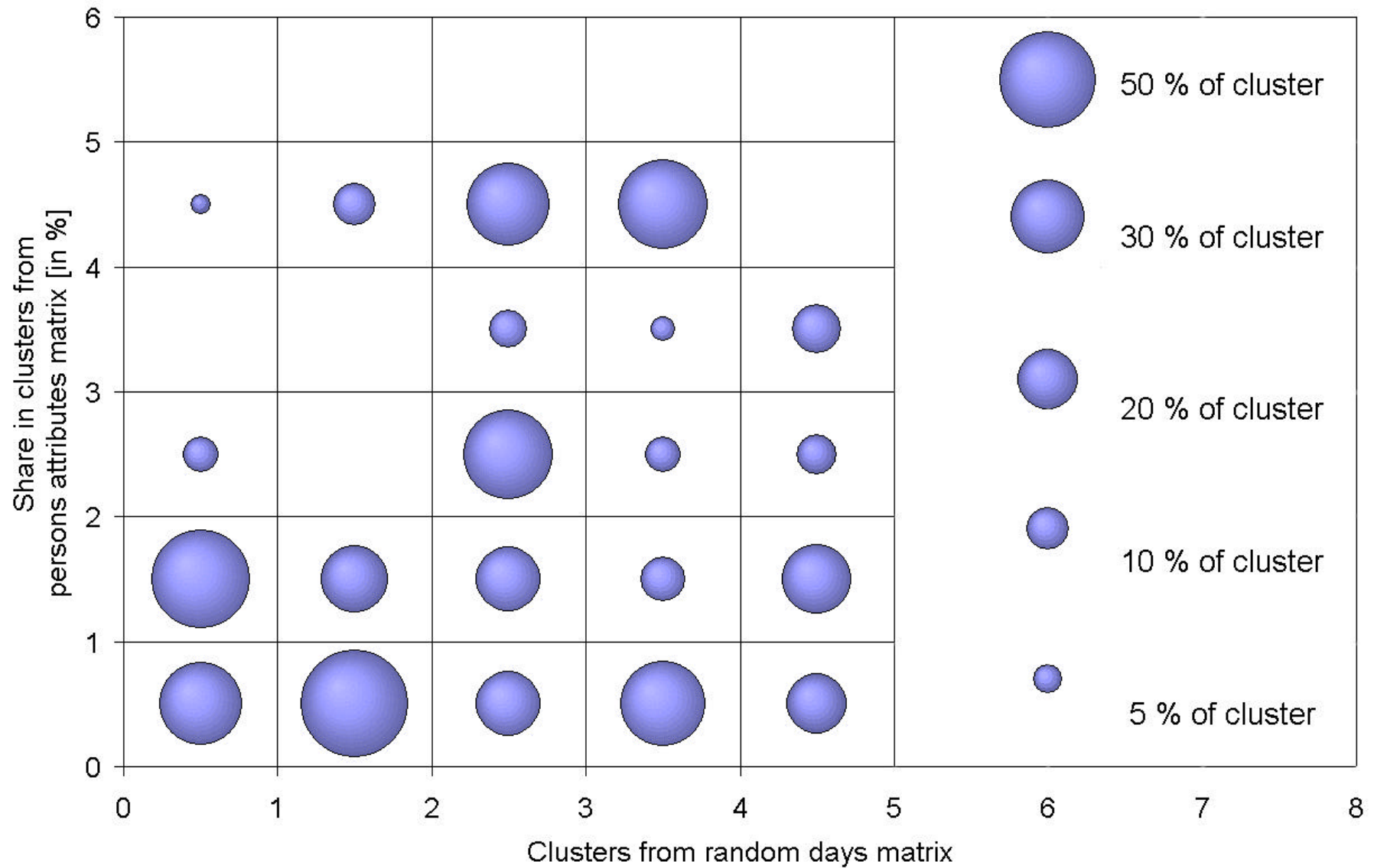


Cluster 1



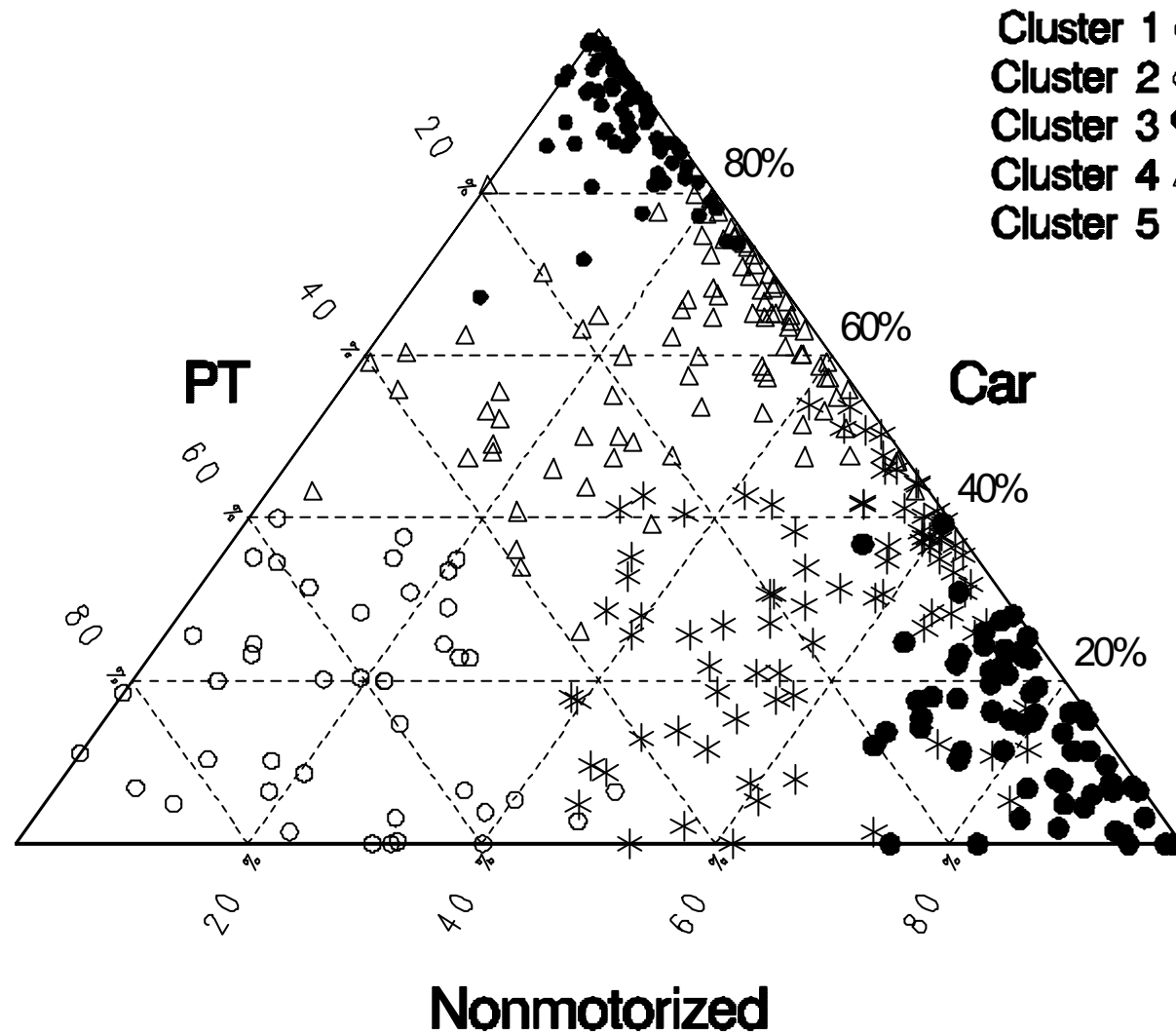
Cluster 3

# Cross classification



# Person attribute matrix: Share of modes

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## Description of the person-attribute matrix clusters

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### Cluster 1: “Working men”

- ++ distance per trip, share of working trips, male persons, employed person, cars per household, morning trips, car trips
- + immobile days, parents
- o number trips/day, intrapersonal variability
- shopping trips

### Cluster 2: “Stable behaviour”

- ++ school trips, leisure trips, pupils, young persons, public transport
- + employed persons
- car trips, intrapersonal variability, number of trips per day, shopping trips



## Description of the person-attribute matrix clusters

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### Cluster 3: “Local Cluster”

- ++ school trips, pupils, young persons, unmotorised trips, retirees
- + share of immobile days, women, trips in morning  
employed persons, parents, trips at weekend
- distance per trips

### Cluster 4: “Active families”

- ++ parents, trips per day, intrapersonal variability
- + employed persons, average distance per trip, car trips
- immobile days

## Description of the person-attribute matrix clusters

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### Cluster 5: “Average cluster”

- + unmotorised trips
- o employed persons, age, parents, different trip purposes, number of trips/day intrapersonal variability
- average distance

# Summary

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Classification based on a comparison of person attributes

- 5 cluster solution
- Good differentiation in terms of travel characteristics
- Reasonable differences for the sociodemographic characteristics

Classification based on a comparison of one random day with multidimensional sequence alignment :

- 5 cluster solution does not give different clusters in terms of sociodemographics
- Additional information from order of activities

# Outlook

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## Further research: Sequence alignment

- Check for more than one random day
- Check robustness of the approach
- Check other classification methods

## Further research: Travel behaviour

- Relevance for transport policy