



# **CITY GROWTH AND ZIPF'S LAW**

**Hélène van Heijningen & Matthijs Brouns**

**CPB: Bureau for Economic Policy Analysis**

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# CPB AND ZIPF'S LAW

- The largest cities in a country show a Zipfian distribution
- Can we influence this type of city growth?

- Can we change behavior?
- What

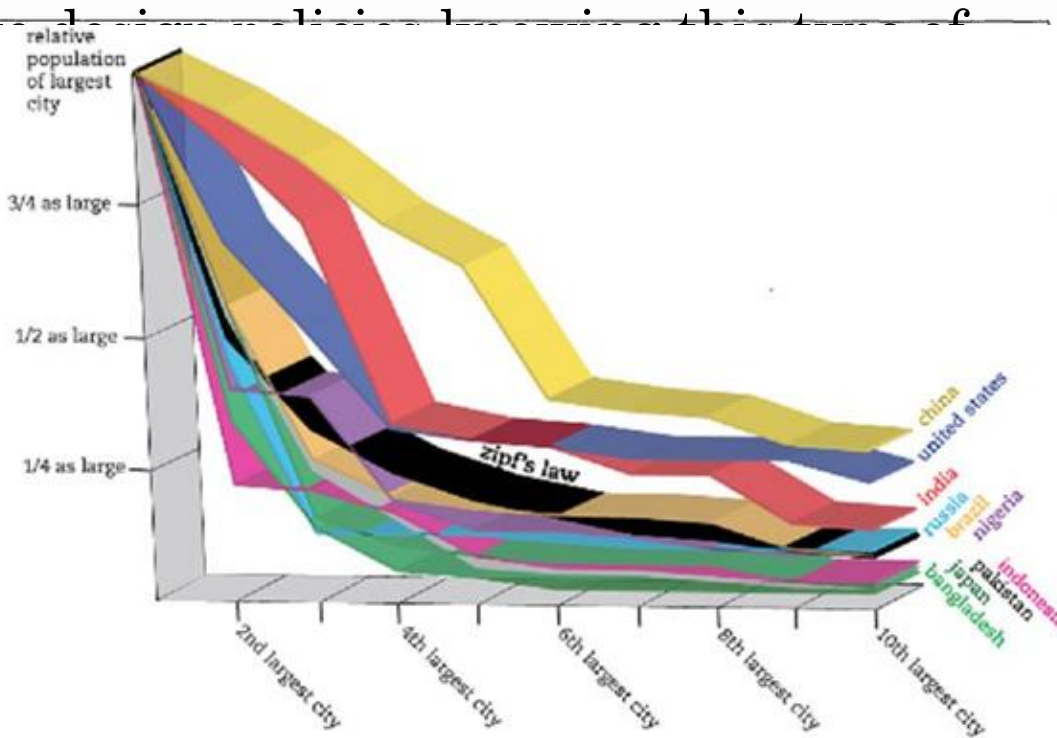


FIGURE I

Log Size versus Log Rank of the 135 largest U. S. Metropolitan Areas in 1991  
Source: Statistical Abstract of the United States [1993].

# RESEARCH QUESTION & APPROACH

- Focus: Decisions made on household level

## Research question:

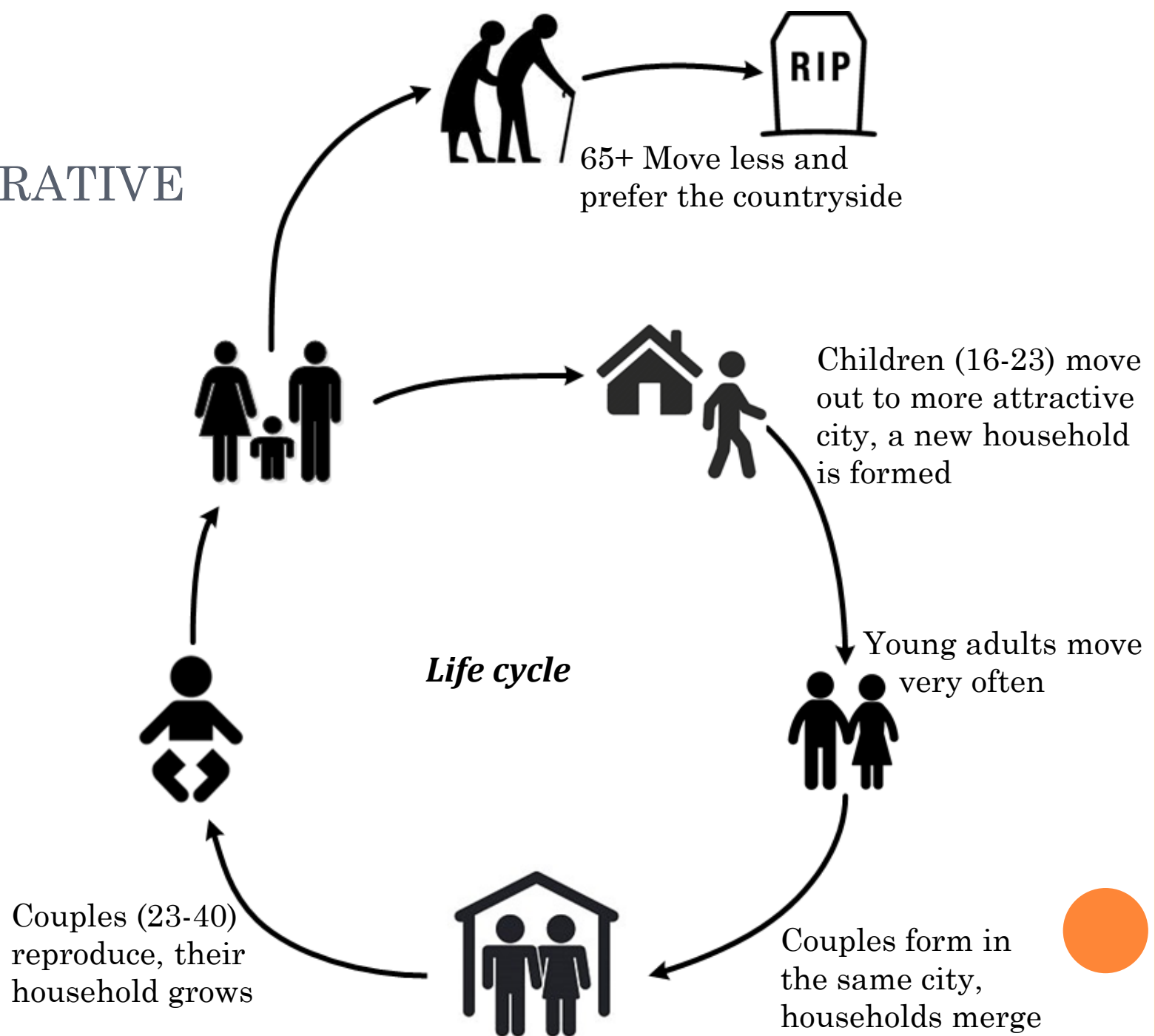
*How do decisions made at household level influence moving behaviour between cities to cause the emergence of the Zipf's law?*

## ○ Approach:

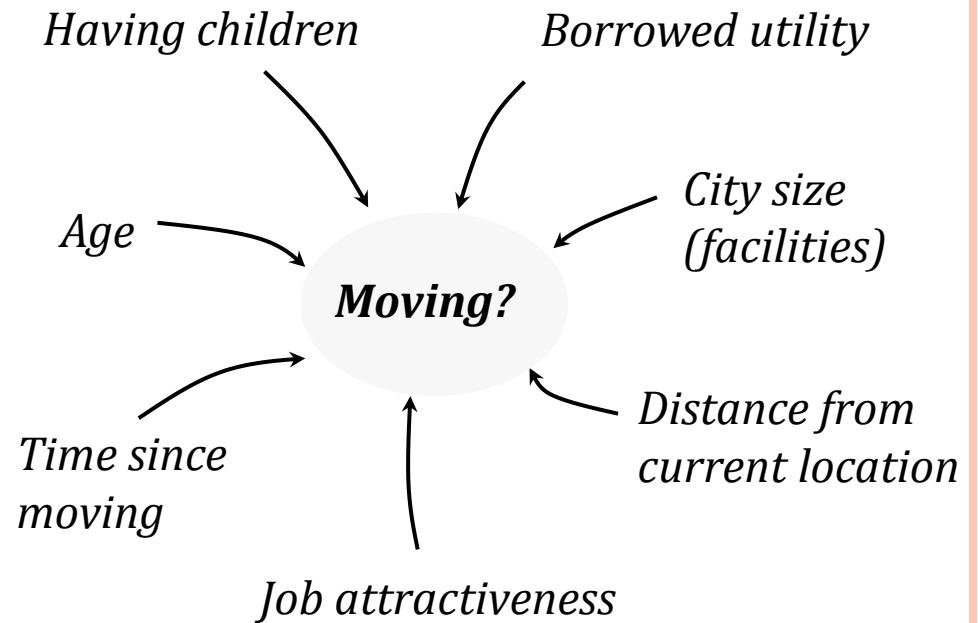
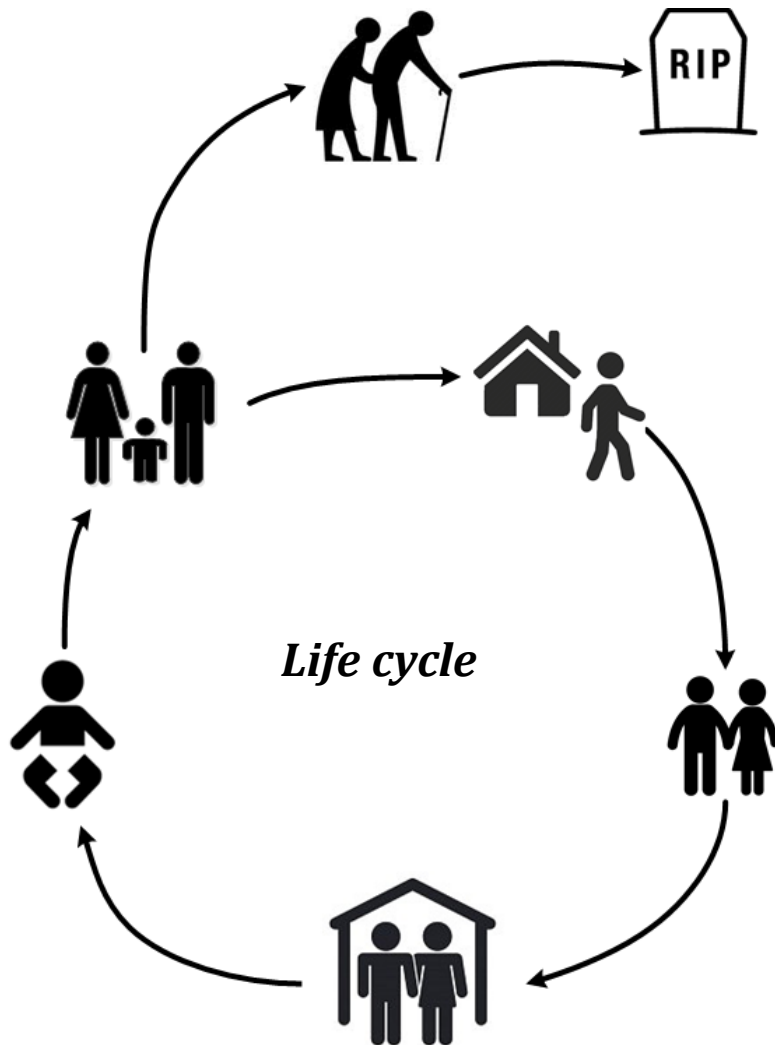
- Literature research: for what reasons do people move?
  - Stage of Life
  - Job opportunities



# NARRATIVE

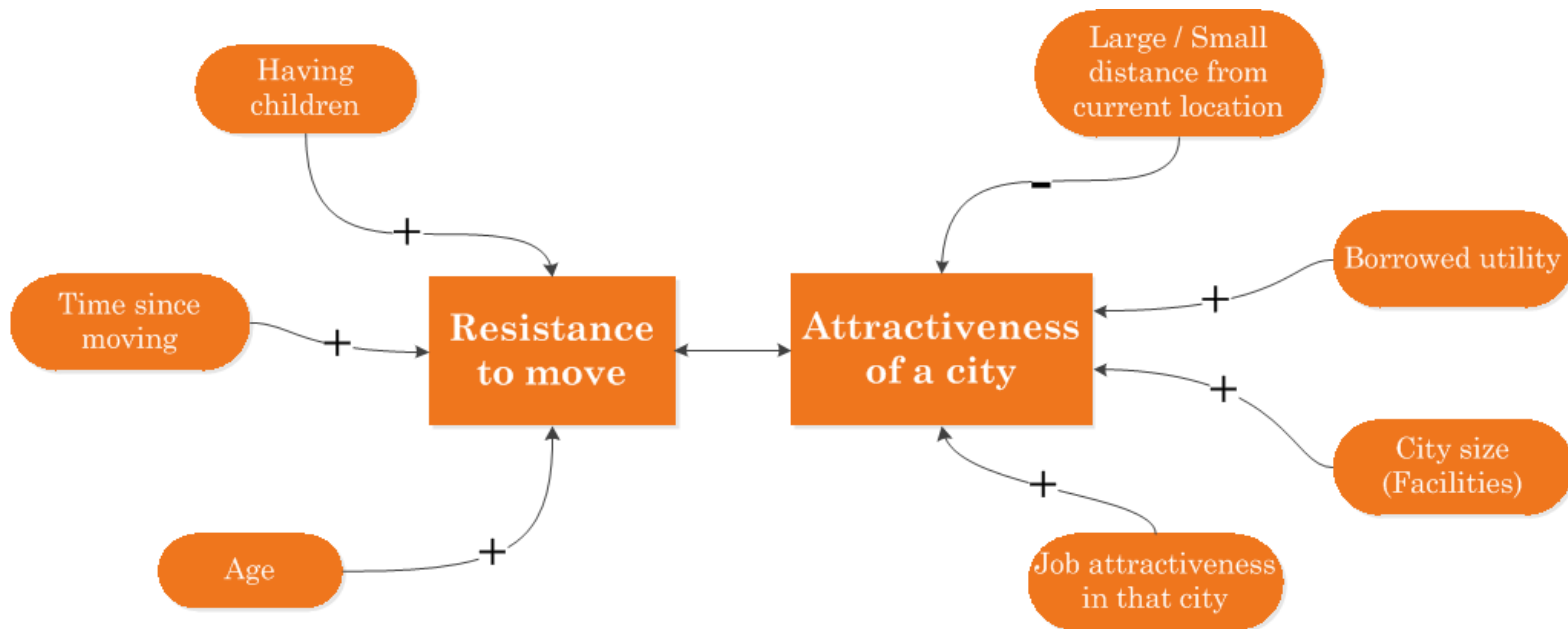


# NARRATIVE

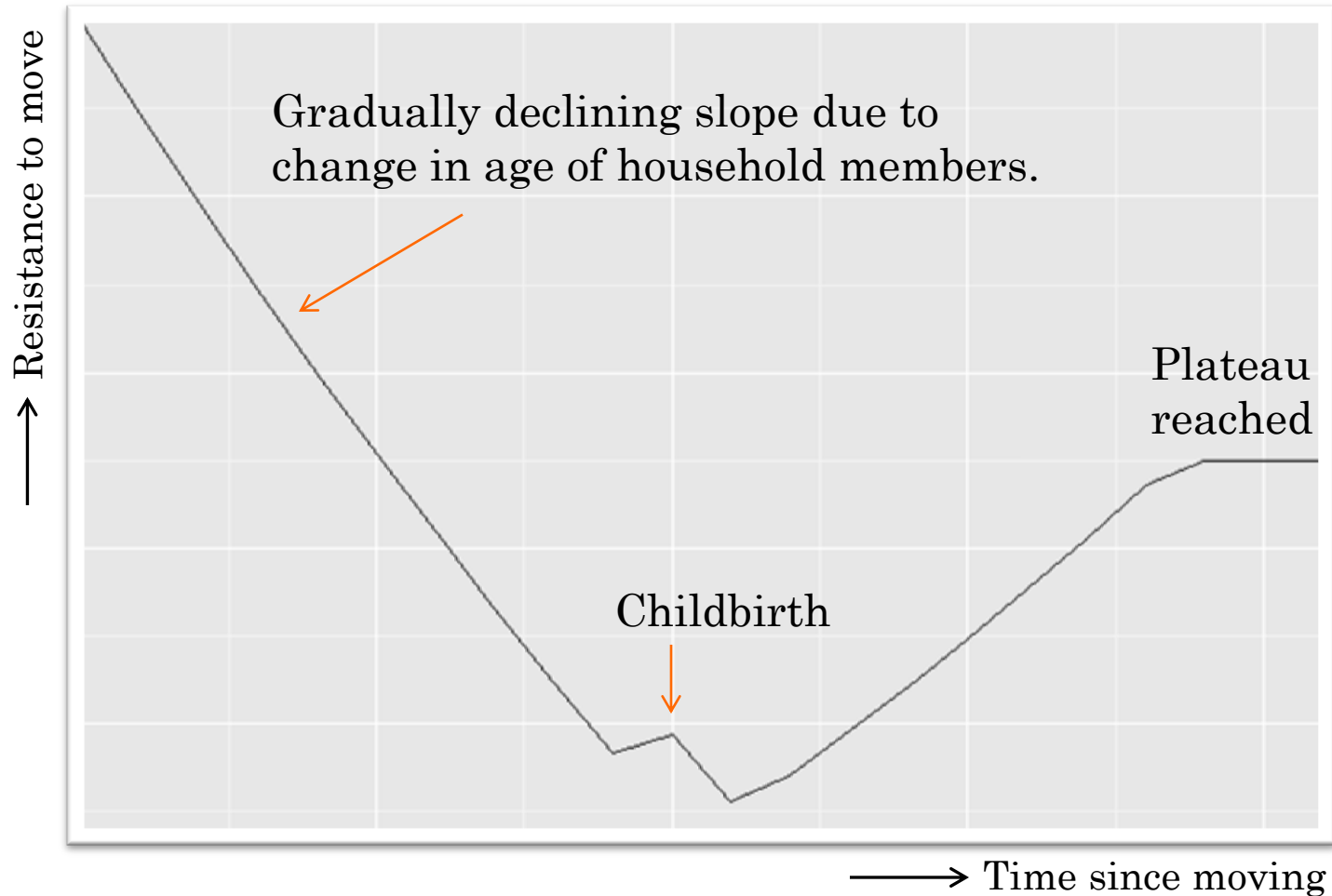


# MODEL LOGIC

- Rule: A household moves to a random city for which its 'Attractiveness' > 'Resistance to move'

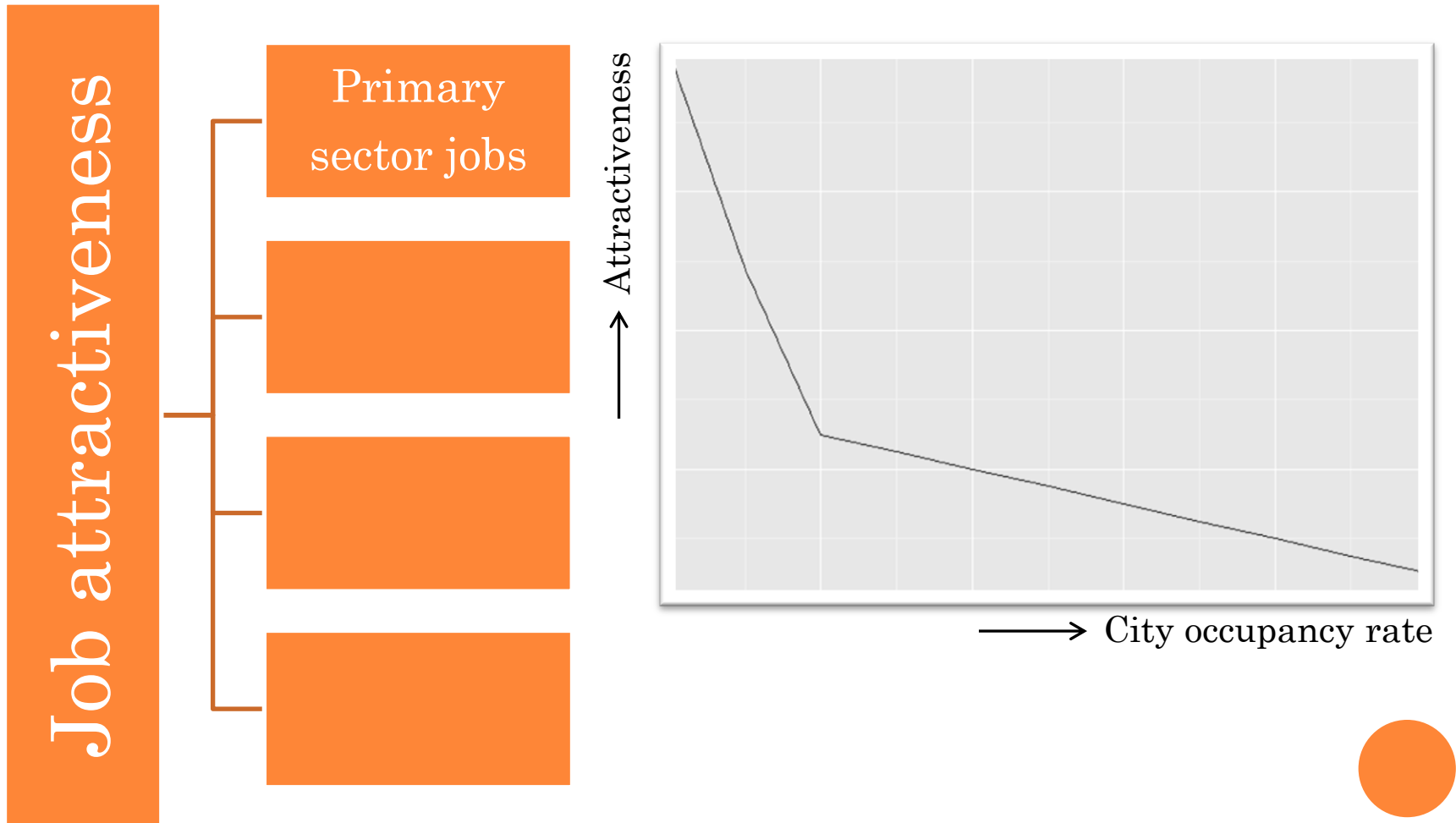


# MODEL LOGIC: RESISTANCE TO MOVE

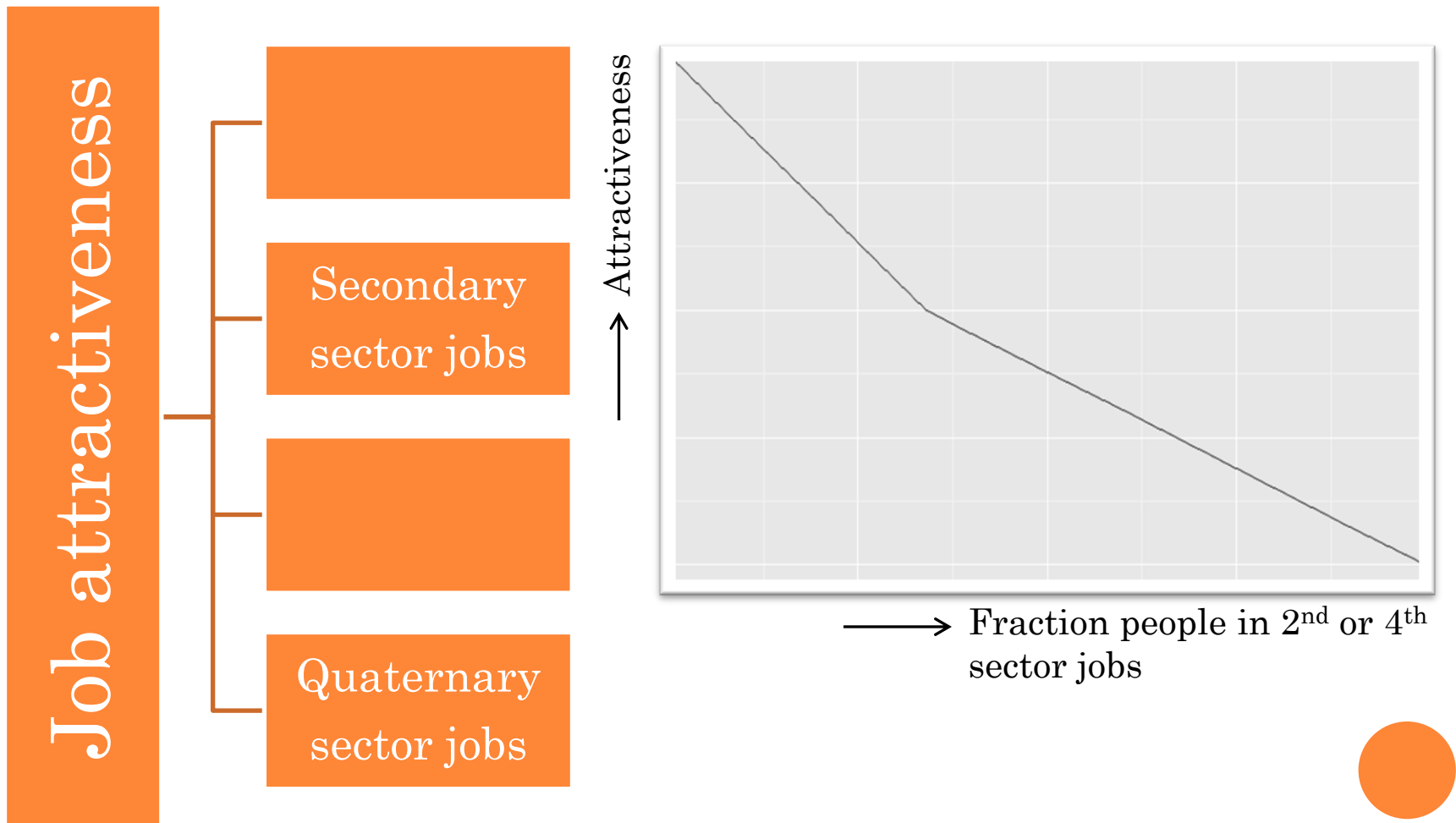




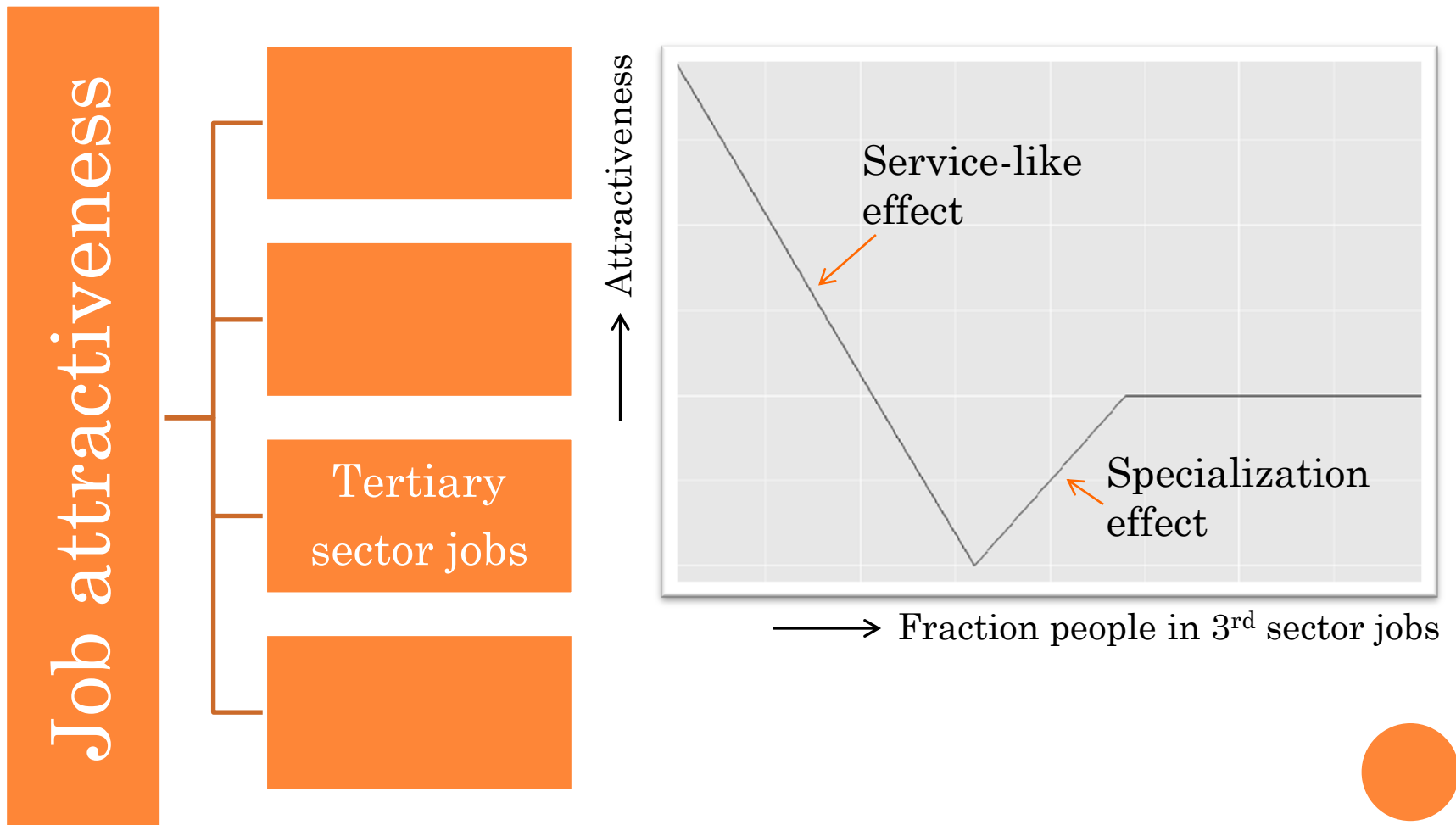
# MODEL LOGIC: JOB ATTRACTIVENESS



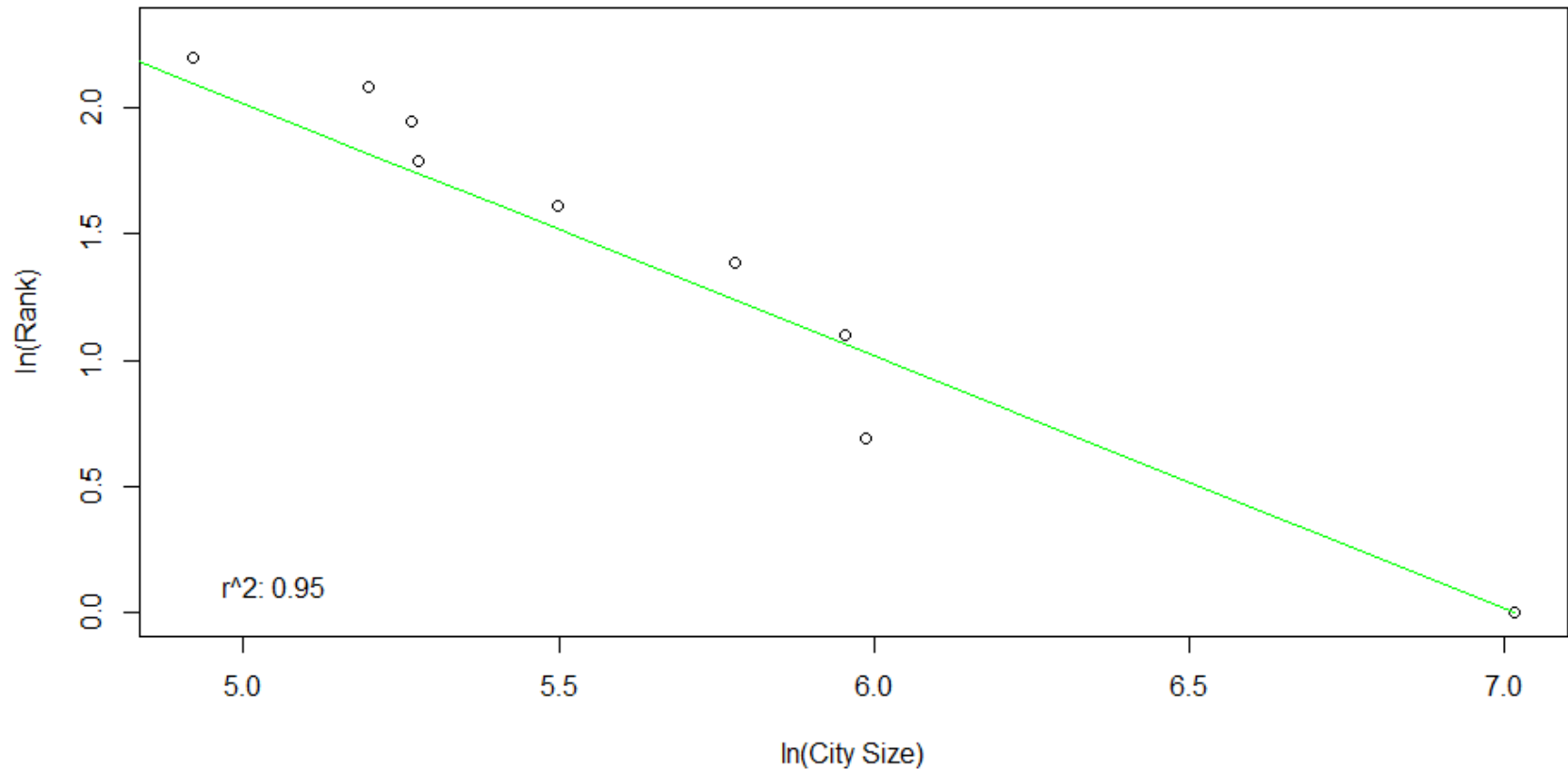
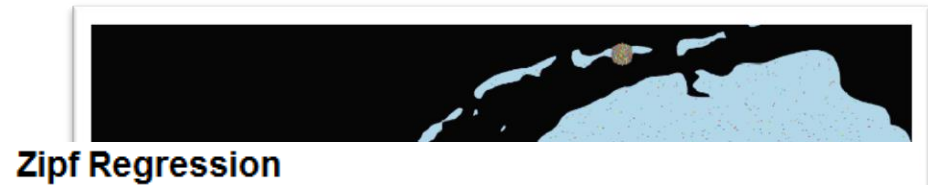
# MODEL LOGIC: JOB ATTRACTIVENESS



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# MODEL OUTPUT



- Number of households in and out of cities
- Number of households for the 10 different cities



# VERIFICATION & VALIDATION

## ○ Verification

- 6 Tests on a single-agent, minimal interaction and multi-agent level
- The model is implemented as intended

## ○ Literature validation

- Parameters and relations are based on literature

## ○ Face validation through expert consultation

- Assumptions
- Relations
- Concepts



# EXPERIMENTAL DESIGN

- Which variables have the most influence on creating the desired model output?
- Multi-variate analysis
- Latin hypercube
- Because of long run time, limited number of runs (300)
- Compare R-squared to a pure Zipfian distribution
- R-squared  $> 0,80$  found in literature

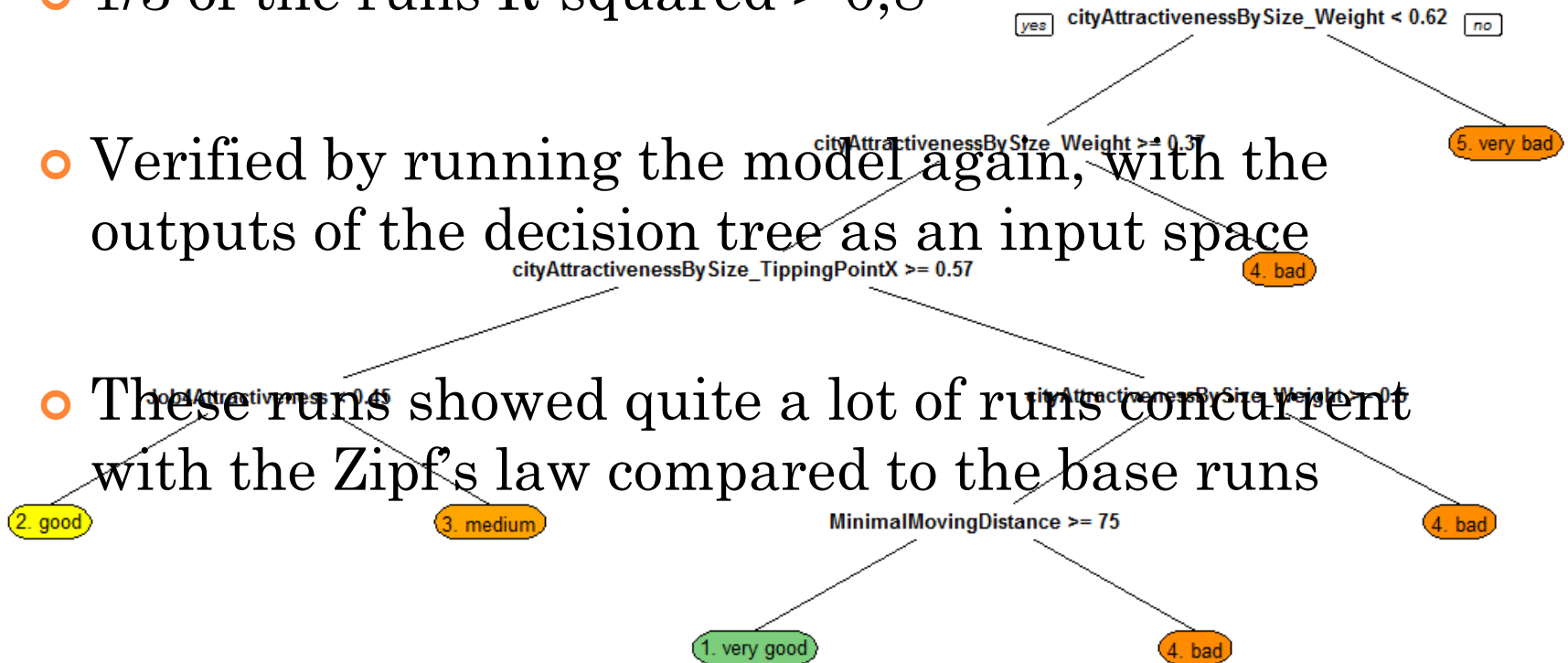


# MODEL EXPERIMENTATION

- 1/3 of the runs R-squared  $> 0,8$

- Verified by running the model again, with the outputs of the decision tree as an input space

- These runs showed quite a lot of runs concurrent with the Zipf's law compared to the base runs



# CONCLUSIONS

- Our model is able to produce cities according to a Zipfian distribution
- However, very specific parameter values are needed to obtain a Zipfian distribution
- The Zipf's law has been around for centuries
- Two variables seem to have the most effect:
  - The city size effect
  - Distance between cities
- Do we now understand why a Zipf's law emerges?





# FUTURE RESEARCH

- Why doesn't the Zipf's law fit as well in the Netherlands as it does abroad and how does this affect decision making?
- What happens when European borders disappear entirely?
  - Will Paris or London become the most important city?
  - What will happen to our cities?



# NETLOGO IN PRACTICE

- Netlogo is all about turtles, and it moves about as fast as one
- Too much time spent on making model run at reasonable speeds
  - Table implementation 100x slower than regular list
  - Subtracting sets undoable
- No support for unit testing or assertions
- Memory leaks in RNetlogo
- Overall unsuitable due to speed limitations



# MODEL FILES & REFERENES

- If you're interested in the model files and documentation, please visit:

<https://github.com/MBrouns/Zipfs-Law-and-city-development>

- References
- Newitz, A. 2013. *A mysterious law that predicts the size of the world's biggest cities*. Retrieved from: <http://io9.com/the-mysterious-law-that-governs-the-size-of-your-city-1479244159> at the 6th of January, 2015.
- Infrastructurist. 2011. *A Capital On The Move*. Retrieved from <http://keith-travelsinindonesia.blogspot.nl/2011/06/capital-on-move.html> at the 20th of January, 2015.

