
A mathematical model of complex mobility patterns for big traffic generators competition and sustainability

Paolo Giordano

Modeling and Applications of Complex Systems
Laboratory

University of Lugano

The problem

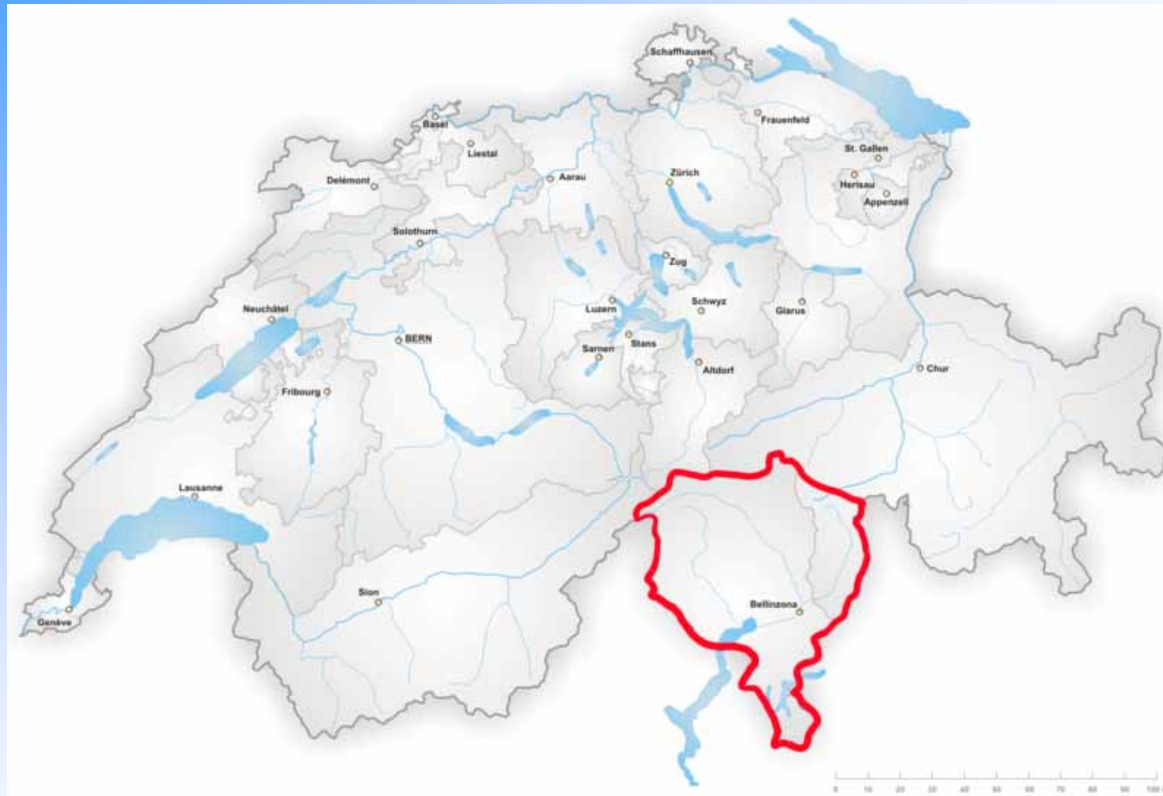
To support decisions about the following:

Simulate and measure the environmental impact of BTG:

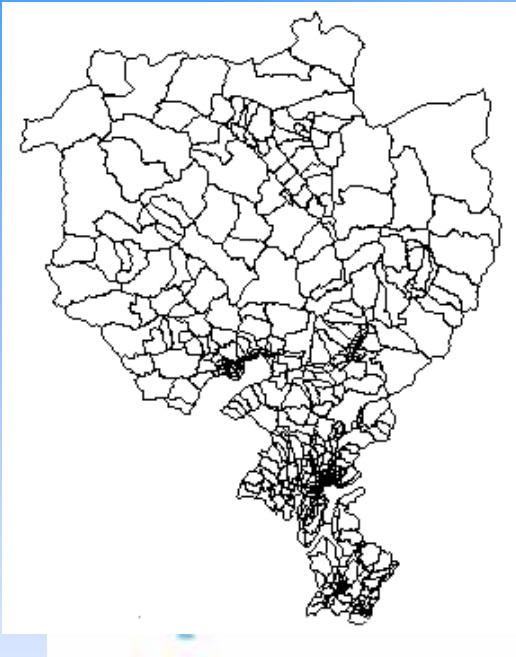
1. to use a mathematical model of BTG to define what is a BTG in a normative sense;
2. what zones of Ticino are suited for hosting new BTG
3. what thresholds should be applied for limiting the amount of BTG in each zone

Find the best placement for a BTG from the economical point of view

General data about the model



General data about the model



Ticino, Switzerland, about 150'000 inhabitants

517 **zones**

Economical activities subdivided in 45 categories:

- retailer of foods, drinks
- retailer of furniture
- retailer of do it yourself tools
- banks
- retailer of electronic devices
- retailer of clothing
- ...

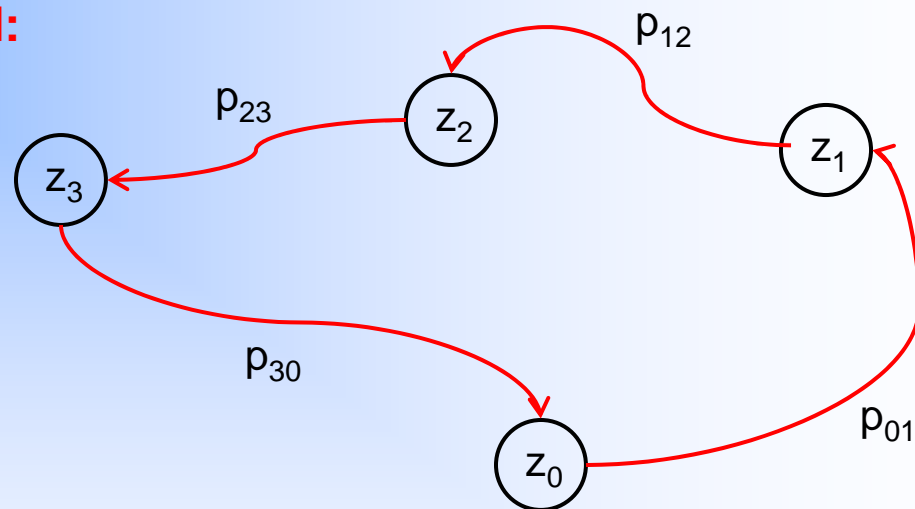
Three time windows:

- Average working day
- Saturday
- Sunday

Complex mobility patterns 1/2

One of the problems in the modeling of BTG related dynamics is that individuals follow “**complex mobility patterns**”, i.e. movements that are not only origin-destination, but can include more than one destination for more than one goal

Kernel:



Goals: $g = (g_1, g_2, \dots, g_s)$

- To buy necessities
- to buy complements
- to do shopping
- to spend time for fitness
- to buy furnitures
- ...

Complex mobility patterns 2/2

Characteristics of movement: $c = (c_1, c_2, \dots, c_p)$

a family of parameters defining boundary conditions under which the movement takes place:

- the preferred time window to start the movement
- the relative importance of goals
- fuzzy constraints over the average time and money to be spent for each goal

The pair (g, c) is called **type of movement**

Example of complex mobility pattern:

- to buy necessities (g_1) in z_1 and complements (g_2) in z_2 starting from home z_0 , using the paths p_{01} , p_{12} and p_{20}
- on the weekend (c_1)
- with necessities much more important than complements (c_2)
- using average time and money for necessities and not so much time and money for complements (c_3)

The modeling framework: Interaction Spaces

The system has been modelled as an **Interaction Space** (IS), a new type of mathematical structure aiming to define complex systems made by several interacting entities

IS generalize both multiagents systems and cellular automata and can be seen as a good interpolation between AI based methods and Physics' methods

In an IS one can use:

- **continuous** or **qualitative** state variables
- **populations of agents** instead of single agents
- there is a clear mathematical definition of **cause-effect relation** between interactions
- **differential equations for extensive variables** and their probability distributions (general theorem not a starting point)
- **synchronous** (discrete time) or **asynchronous** (continuous time) dynamics

Axiomatic theory of complex systems

Interacting entities

Commercial surfaces and other BTG

configuration space: amount of commercial, spatial position, number of parking places

Links of the transportation network

configuration space: georeferenced position, speed limit, slope, lanes, a classification into 45 functional categories, maximum capacity

Populations of individuals residing in a given zone

configuration space: spatial coordinates of the zone, statistical data describing the population, for every type of movement: average number of movements, average time spent, average money spent

Complex mobility patterns

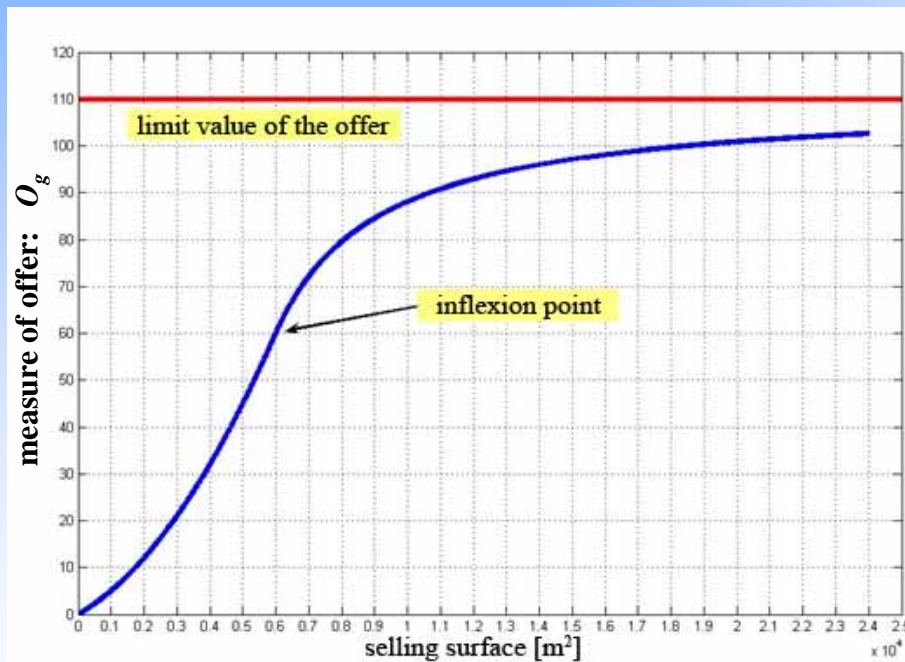
Temporary moving entities: members of a population currently involved in a trip

configuration space: specific residential location, the socio-economical status of the entity, a pointer to a CMP

Attractiveness indicators 1/2

We define an attractiveness indicator for a BTG using **fuzzy logic** methods

The attractiveness depends only on a given **set of goals** $g = (g_1, g_2, \dots, g_s)$



In the considered BTG there is a **selling surface** s_i for the goal g_i

The offer $O_{g_i}(s_i)$ of the BTG related to that goal g_i is an increasing function of the selling surface s_i

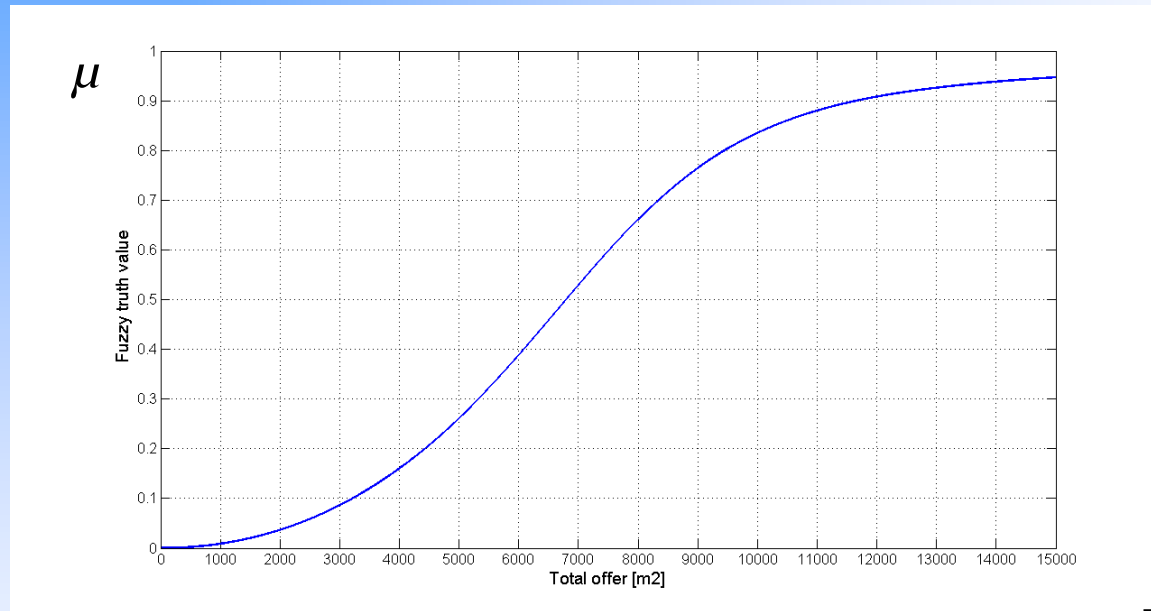
Total offer:

$$O = \sum_{i=1}^s O_{g_i}(s_i)$$

Attractiveness indicators 2/2

Now we measure the fuzzy truth of the sentence:

Is it high a value O of total offer?



Attractiveness indicator:

$$\mu \left(\sum_{i=1}^s O_{g_i}(s_i) \right)$$

$\beta(\text{services})$

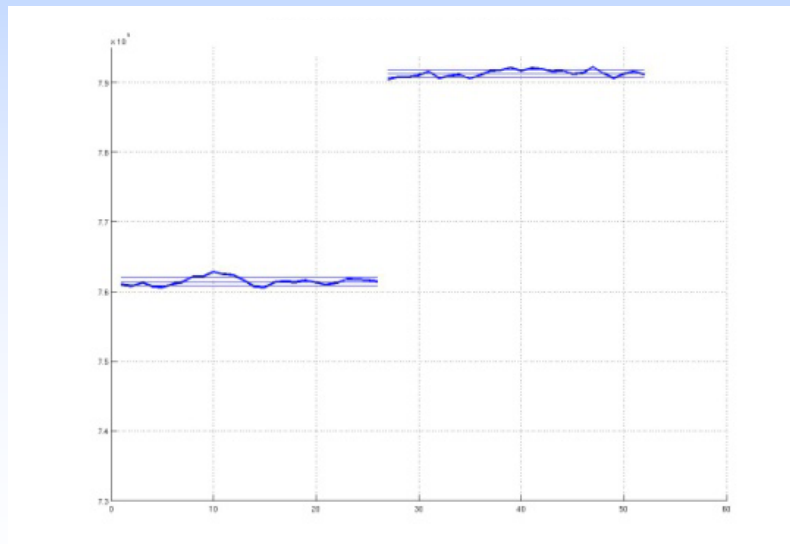
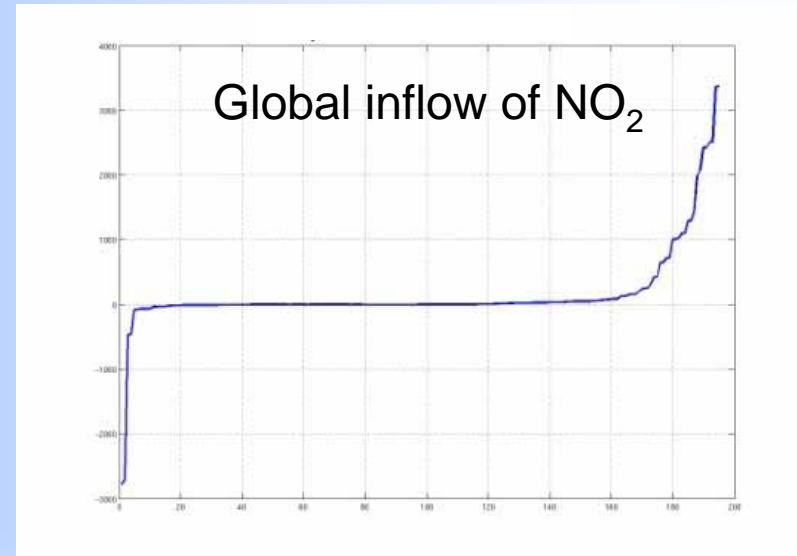
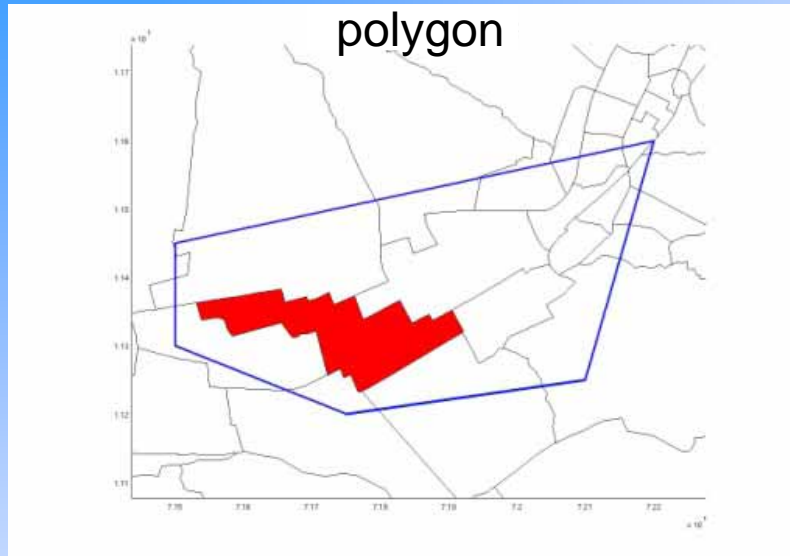
Fuzzy operator "very"

Decreasing function of the selling surface of services

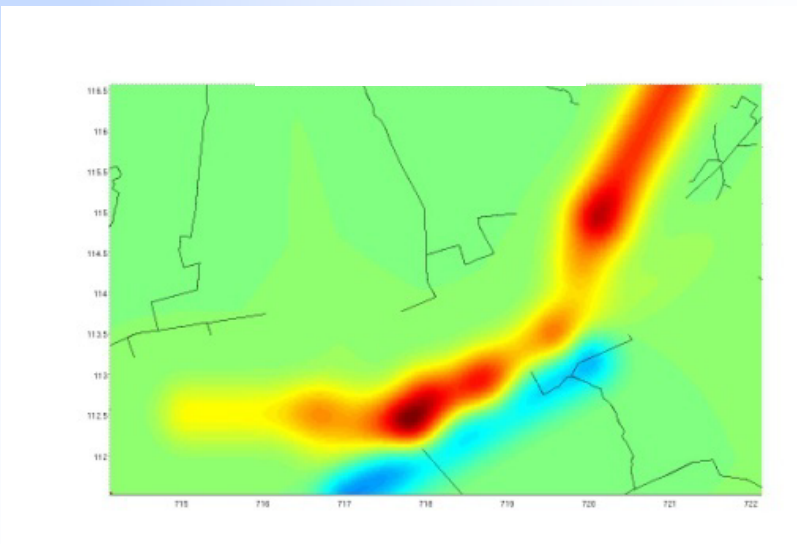
Interactions

1. **Generation of temporary moving entities** (TME) and types of movements based on statistical properties of the population
2. **Selection of a set of zones** by a TME giving higher probability to zones having BTGs with higher attractiveness
3. **Routing**: choosing of a path to connect two zones giving greater probability to paths with lower run time (memory about congested roads in the past weeks)
4. **BTG related activities**: spent time and money based on constraints given by the origin population

Examples of simulated observables

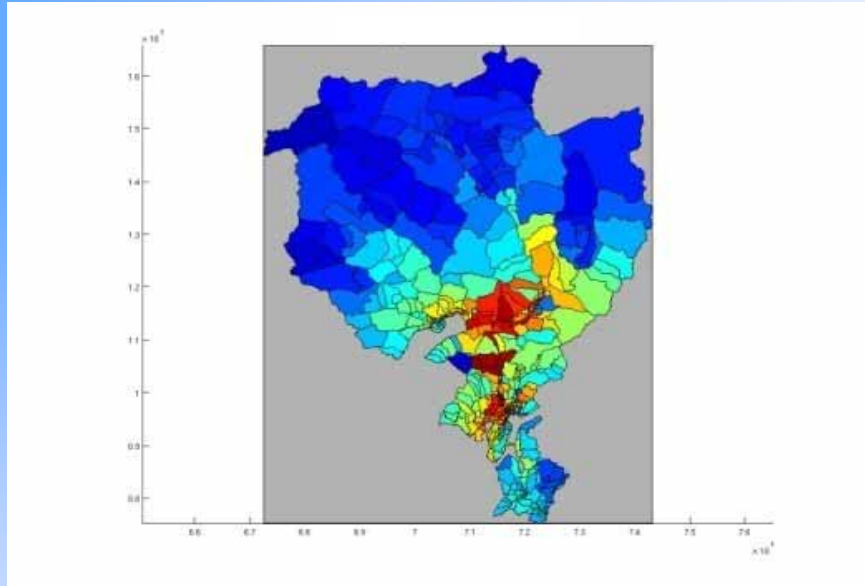


Inflow of NO₂ on a single link

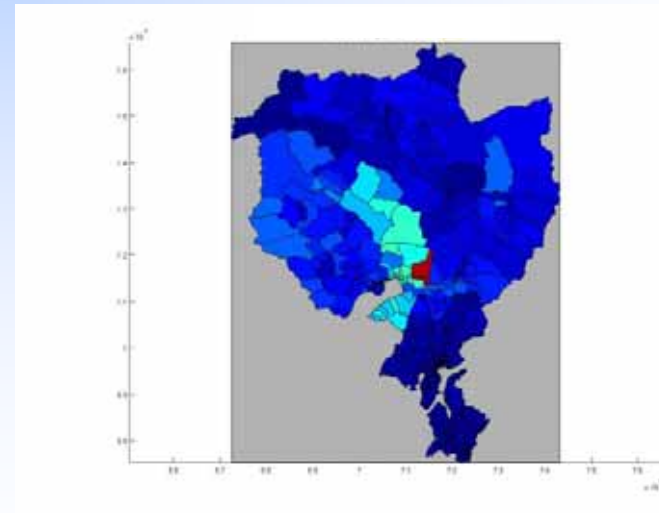
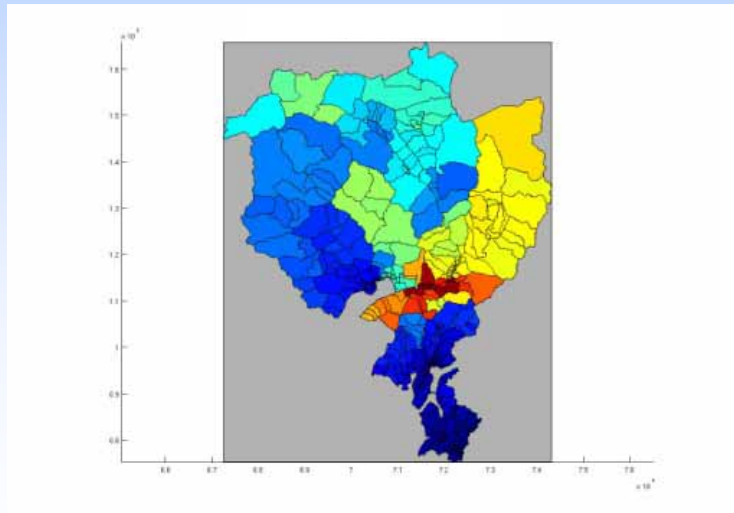


Map of inflow of NO₂

Indicators for BTG placement



Fields of pressure
for a new shopping
center for a given
goal



Catchment areas of new shopping centers

Calibration and validation

Calibration:

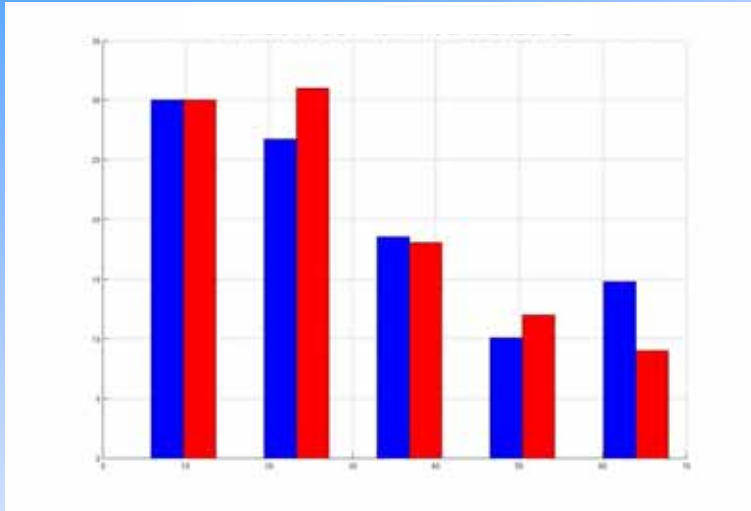
1. We calibrated the parameters of the attractiveness indicator so as to obtain the expected classification of BTGs:

1: Morbio Inferiore (Ghitello)	95
2: SantAntonino (Centri Commerciali)	92
3: Muralto (Stazione)	89
4: Losone (Al Ponte)	86
5: Lugano (Municipio)	84
6: Grancia (Centri Commerciali)	72
7: Biasca (Stazione)	71
8: Bellinzona (Collegiata)	69
9: Canobbio (Piano Trevano)	67
10: Mendrisio	66
11: Chiasso	57
12: Agno (Paese)	54
13: Lugano (V. Brentani)	54
14: Faido	51

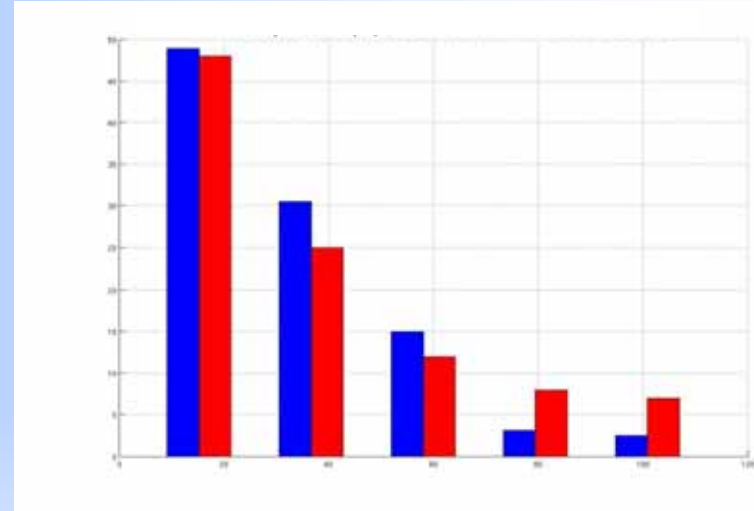
Calibration based on experts' knowledge

Calibration and validation

We calibrated using one survey...



calibration



validation

... and validated using another survey

Further validations about 6 BTGs:

- 1.15915 visits foreseen by the survey and 21794 by the model (error: 36.7%)
2. 21.4 Km on average to reach one of the 6 BTG, 13.2 Km in the model (-38.3%)
3. order of magnitude of inflows of NO₂ as expected by experts

Future improvements

1. Possibility to choose **alternative routes**: now there is only the quickest
2. Endogenous dynamics of **new BTGs** based on the pressure fields
 - searching of the most problematic zones w.r.t. environment
 - searching of the best zones to locate a new BTG
3. Time windows of **1 hour**
 - more reliable estimate of vehicles speed
 - comparison with measured counting data
4. Coupling with a **urban growth model**
 - longer forecasts
 - best estimation of economical risk in the placement of new BTGs
5. **Microsimulation** dynamics for vehicles movements
 - estimation of maximum levels of pollutions
 - estimation of roads' level of service

Contacts

Modeling and Applications of Complex Systems Laboratory

MACS-Lab

University of Lugano
via Canavée, CH-6850, Mendrisio, Switzerland.

Paolo Giordano: pgiordano@arch.unisi.ch

Alberto Vancheri: avancheri@arch.unisi.ch

Denise Andrey: dandrey@arch.unisi.ch