# Including joint trips in a Multi-Agent transport simulation

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Inclusion of joint trips in MATSim

Results

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- joint trip: several individuals traveling in the same private vehicle
- joint traveling: important behaviour
  - occurs frequently in households
  - some policies aim at encouraging such a behaviour
    - HOV lanes
    - car-pooling services
- currently, few means of predicting such a behaviour exist
- traffic simulation is an important tool for policy evaluation
- micro-simulation, by simulating individuals explicitly, allows to simulate a wide range of behaviours

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## The MATSim software

- MATSim: Multi-Agent Transport Simulation
- open source software (GNU GPL)
- written in Java
- Mainly developped at ETHZ, TU Berlin, Senozon

## The MATSim process in a nutshell

- ▶ state of traffic in an average day: (stochastic) user equilibrium
- a strategy (daily plan) can be modified by changing dimensions easy to change in the short-term (day-to-day)
- dimensions corresponding to long-term changes (*eg.* home and work places) are exogenously determined (boundary conditions)
- search process: "co-evolutionary" algorithm
  - works with a population of heterogeneous agents
  - each agents *i* tries to solve  $\max_{p_i \in P_i} U(p_i | p_{-i})$
  - influence of  $p_{-i}$ : via congestion

## The MATSim process steps



## The MATSim process steps



- replanning:
  - creation of new plan
    - random mutation
    - optimisation given the travel times in the previous iteration
  - selection of a past plan based on experienced score
    - probabilistic (RUM)
    - deterministic (best past plan)

MATSim and joint trips (1): MATSim

remember the agent's problem?

- $\max_{p_i \in P_i} U(p_i | p_{-i})$
- ► |p<sub>-i</sub> estimated via "mobility simulation"
- ► |p\_i actually differs between iterations
- remember MATSim's process?
  - agents actually "knows"  $U(p_i|p_{-i}) \approx U_I(p_i)$
  - |p\_i: effect of experienced congestion in the last execution (iteration 1): "empirical" knowledge
  - this is usually valid enough:
    - changing plans of few agents only has a minor influence on the state of traffic
    - actually reproduces human learning

MATSim and joint trips (2): joint trips

what about joint travel?

- ▶  $p_{-i} = \{p_j\}_{j \in S_i} \bigcup \{p_k\}_{k \notin S_i}$  with  $S_i$  the set of co-travelers
- ► S<sub>i</sub> typically very small
- each  $\{p_j\}_{j \in S_i}$  has a lot of influence
  - participation in joint travel
  - departure time for the joint trip
  - "utility transfers" (altruistic behaviour, monetary compensation)
- ▶ individuals typically aware of (relevant part of) {p<sub>j</sub>}<sub>j∈S<sub>i</sub></sub> (agreement): "theoretical" knowledge
- ► necessary to find a way to actually correlate plan selection based on U(p<sub>i</sub>|{p<sub>j</sub>}<sub>j∈S<sub>i</sub></sub>)

## MATSim and joint trips (2+1): joint trips in MATSim

To solve those problems, the equilibrium is defined over groups of agents:

- new "aggregated" data structures are defined
  - ▶ Person  $\rightarrow$  Clique
    - ▶ groups Persons which (can) travel together ( $i \in C \Rightarrow S_i \subset C$ )
    - maintains a set of JointPlans
  - $\blacktriangleright \ \mathsf{Plan} \to \mathsf{JointPlan}$ 
    - groups individual plans, always selected together
    - is affected a score (currently, the sum of the scores of individual plans: full utility transfers)
- replanning modules work at the aggregated level (competing cliques)
- ▶ joint trip: access leg  $\rightarrow$  pick-up  $\rightarrow$  shared leg  $\rightarrow$  drop-off  $\rightarrow$  egress leg
- mobility simulation works with individuals

## Remarks on joint trip generation

- most of the joint-trip generation approaches in the literature are specific to households
- ▶ in the context of MATSim, three approaches are possible:
  - generation a priori (exogeneous)
    - allows to adapt to different contexts (household, car-pool...)
    - joint trips not part of the equilibrium
  - generation during the iterations (endogeneous)
    - joint trips truly part of the equilibrium
    - increases the search space size
  - "hybrid"
    - a limited set of possible joint trips is identified beforehand
    - joint trips from this set can be selected/unselected during the optimisation

- optimisation of activity durations and mode
  - uses Tabu Search
  - estimates travel times based on the events of the previous simulation run
  - mode is optimised at the subtour level
  - plans are synchronised by penalising unsynchronized plans

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- best plan selection

At each iteration, for each clique, one of the following strategies is executed:

- optimisation of activity durations and mode
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  - estimates travel times based on the events of the previous simulation run
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▶ ...

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## The Scenario

A scenario for the urban area of Zürich:

- 10% sample
- car-pooling matches computed by a partner
  - maximum detour time with time windows
- "default" (i.e. uncalibrated) utility parameters

## Influence of constraints

- two major constraints implied by a joint trip:
  - synchronisation
  - mode chaining
- what influence do they have on the outcome?
- 3 runs:
  - no synchronisation, no mode chaining constraints
  - no synchronisation, mode chaining constraints
  - synchronisation, mode chaining constraints

## Influence of constraints: synchronisation no synchronisation, mode chaining constraints:



time (h)

## Influence of constraints: synchronisation synchronisation, mode chaining constraints:



time (h)

## Influence of constraints: mode chaining

no synchronisation, no mode chaining constraints:



time (h)

### Influence of constraints: mode chaining no synchronisation, mode chaining constraints:



time (h)

## Influence of constraints: scores



## Travel time improvements



clique size

## Score improvements



clique size

## Score improvements



clique size

## What can we get from those results?

- major influence of mode chaining constraints on the attractiveness of joint trips
- need to consider other dimensions than travel time in attractiveness of joint trips vs other modes
  - monetary costs (fuel, tolls...)
  - car availability (household)
  - willingness to share time with social contacts

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## Next steps

- joint trip generation/selection
  - initial demand model
  - replanning-level (for small cliques, eg. households, or social-network-based)
- include monetary cost in utility function
- relaxation of the "utility transfers" hypothesis
  - ▶ actually use  $U(p_i|\{p_j\}_{j \in S_i})$  to correlate plan choice
    - deterministic: iterative removal of dominated strategies
    - stochastic: joint choice probability
    - main issue: estimate efficiently conditional utility for all possible combinations
  - finer modeling of social contacts and willingness to help
  - allows more complex networks than isolated cliques
- extend the Clique concept to represent households
  - car availability
  - joint activities
- validation against aggregate data

Thank you for your attention

## Any question?