# Ride-sharing with Inflexible Drivers in the Paris Metropolitan Area

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#### Outline

- Introduction
- 2 Methodology
- 3 Application to Île-de-France
- 4 Conclusion

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#### Motivations

- Low vehicle occupancy, especially for commuting trips (1.05 persons per vehicle on average for commuting trips in Île-de-France, EGT, 2010)
- Increasing vehicle occupancy would decrease congestion and pollution
- The French government is subsidizing ridesharing drivers (up to 100 euros for new drivers)
- What would be the impact of a large-scale development of ridesharing?

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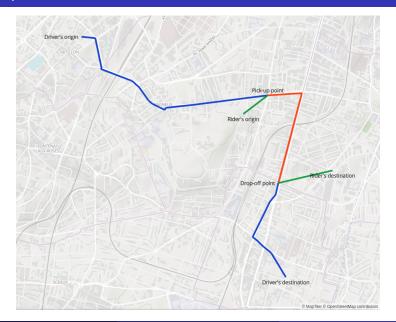
# Ridesharing Scheme

We propose the following ridesharing scheme:

- Drivers keep their chosen route and departure time (no detour and same schedule)
- Drivers can be compensated by state subsidies for the (small) inconvenience cost of having someone in their car
- Riders walk from origin to a pick-up point and from a drop-off point to destination
- The trip is free-of-charge for the riders
- The matching between drivers and riders is centralized

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# Example



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#### Results

We propose a methodology to evaluate the impact of such a ridesharing scheme, with an application to the **Île-de-France** region using the transport simulator **METROPOLIS**.

Results with 30 % of people willing to participate in the scheme:

- Ridesharing share: 3.3 %
- Average walking time (for riders): 4 minutes and 53 seconds
- Variation of mileage: decrease of 204 000 vehicle-kilometers (2.2 %)

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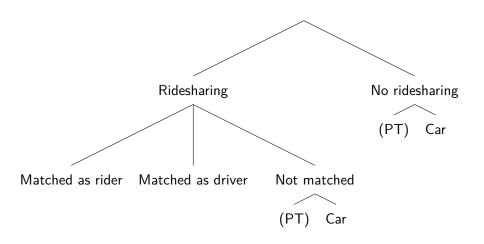
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# Four-Step Procedure

- We run a simulation of METROPOLIS without ridesharing to identify the routes and departure times chosen
- We compute the ridesharing costs for any pair of agents participating in the ridesharing scheme
- We find the optimal matching (Linear programming algorithm)
- We run a new simulation of METROPOLIS, excluding the riders, to get aggregate results (e.g., congestion level, mileage, mode shares)

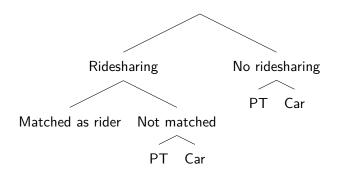
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#### Choices for former car drivers



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# Choices for former public-transit users



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#### **METROPOLIS**

- Mesoscopic dynamic transport simulator
- Mode choice between car and public transit (nested Logit model)
- Departure-time choice (continuous Logit model)
- Route choice (deterministic, minimum travel time)
- Choices are based on the generalized travel cost

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#### Generalized Travel Cost

The generalized travel cost by car includes **in-vehicle cost** and **schedule-delay cost** ( $\alpha$ - $\beta$ - $\gamma$  model):

$$\textit{Cost}_{\mathsf{Car}} = \underbrace{\alpha_{\mathsf{car}} \cdot tt_{\mathsf{iv}}}_{\mathsf{In-vehicle cost}} + \underbrace{\beta \cdot [t^* - t_a]^+ + \gamma \cdot [t_a - t^*]^+}_{\mathsf{Schedule-delay cost}}$$

- ttiv: travel time (in-vehicle)
- t<sub>a</sub>: arrival time
- t\*: desired arrival time
- $\alpha_{car}$ : value of time in the car
- $\beta$ : penalty for early arrivals
- $\bullet$   $\gamma$ : penalty for late arrivals
- $[x]^+ = \max(0, x)$

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# Ridesharing Cost

The generalized travel cost for riders also includes walking cost:

$$Cost_{\mathsf{RS}} = \underbrace{\alpha_{\mathsf{car}} \cdot tt_{\mathsf{iv}}}_{\mathsf{In-vehicle \ cost}} + \underbrace{\alpha_{\mathsf{walk}} \cdot tt_{\mathsf{walk}}}_{\mathsf{Walking \ cost}} + \underbrace{\beta \cdot [t^* - t_a]^+ + \gamma \cdot [t_a - t^*]^+}_{\mathsf{Schedule-delay \ cost}}$$

- tt<sub>walk</sub>: walking time (from origin to pick-up and from drop-off to destination)
- $\alpha_{\text{walk}}$ : walking value of time

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# **Optimal Matching**

The optimal matching is obtained by solving the following **linear programming problem:** 

$$\begin{cases} & \min_{x_i, x_{i,j}} & \sum_i \left[ x_i \cdot Cost_{NoRider}(i) + \sum_j x_{j,i} \cdot Cost_{Rider}(i,j) \right] \\ & \text{s.t.} & x_i + \sum_j x_{j,i} = 1, \quad \forall i \\ & & \sum_j x_{i,j} \le x_i, \quad \forall i \\ & & x_i \in \{0,1\}, \quad \forall i \\ & & x_{j,i} \in \{0,1\}, \quad \forall (i,j) \end{cases}$$

- $Cost_{NoRider}(i)$ : travel cost of i when not a rider (car or public transit)
- $Cost_{Rider}(i,j)$ : ridesharing cost of i when matched with driver j
- $x_i = 1$  if i travels by car or public transit (0 otherwise)
- $x_{j,i} = 1$  if j is a driver for i (0 otherwise)

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#### Data

- Morning peak-period
- Network: 43 857 links, 18 584 intersections and 1360 OD zones
- Demand: 934 042 trips by car or public-transit (commute and non-commute)
- Calibration of METROPOLIS from Saifuzzaman et al., 2012 (EGT 2001)

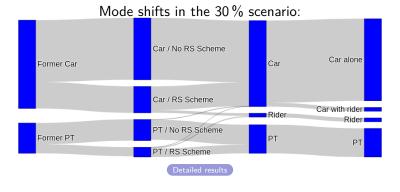
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### Assumptions

- A fixed share of people are willing to participate in the ridesharing scheme (as either a driver or a rider): 10%, 20%, 30% and 40% scenarios are tested
- The walking distance between an origin / destination and an intersection is the **euclidian distance**
- Walking speed is set to 4 km/h

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#### Mode Shifts



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# Aggregate Results

| Scenario                              | Ref.   | 10 %   | 20 %    | 30 %    | 40 %    |
|---------------------------------------|--------|--------|---------|---------|---------|
| Shares                                |        |        |         |         |         |
| Transit modal share                   | 25.5 % | 25.3 % | 24.8 %  | 24.3 %  | 23.9 %  |
| Car modal share                       | 74.5 % | 73.9 % | 73.2 %  | 72.4 %  | 71.5%   |
| Ridesharing modal share               | 0.0 %  | 0.9 %  | 2.1 %   | 3.3 %   | 4.6 %   |
| Surplus                               |        |        |         |         |         |
| Total generalized cost (euros)        | _      | -72763 | -187686 | -305683 | -427401 |
| CO2 emissions reduction (tons of CO2) | _      | 11.387 | 21.809  | 39.372  | 57.900  |
| Road network                          |        |        |         |         |         |
| Congestion                            | 22.1 % | 21.7 % | 21.4 %  | 20.6 %  | 19.8 %  |
| Car VKT (10 <sup>3</sup> km)          | 10 799 | 10740  | 10 686  | 10 595  | 10 499  |

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#### Drivers' Results

| Scenario  | Ref.    | 10 %    | 20 %    | 30 %    | 40 %    |
|---|---------|---------|---------|---------|---------|
| Mean travel time  | 15' 32" | 15' 31" | 15' 32" | 15' 27" | 15' 22" |
| Mean schedule-delay cost (euros)                                    | 2.67    | 2.67    | 2.67    | 2.67    | 2.65    |
| Mean travel cost (euros)  | 6.03    | 6.02    | 6.02    | 6.00    | 5.97    |
| Share of time spent with a passenger (for ridesharing drivers only) | _       | 51.5 %  | 56.1 %  | 58.0 %  | 59.8 %  |

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#### Riders' Results

| Scenario                       | Ref. | 10 %    | 20 %    | 30 %    | 40 %    |
|--------------------------------|------|---------|---------|---------|---------|
| Mean OD distance (meters)      | _    | 5491    | 5972    | 6205    | 6425    |
| Mean walking distance (meters) | _    | 383     | 347     | 325     | 310     |
| Mean car travel time           | _    | 7' 21"  | 8' 00"  | 8' 20"  | 8' 38"  |
| Mean travel time               | _    | 13' 06" | 13' 12" | 13' 13" | 13' 17" |
| Mean travel cost (euros)       | _    | 3.26    | 3.24    | 3.22    | 3.22    |
| Riders at their best match     | _    | 76.7 %  | 69.3 %  | 65.0 %  | 62.2 %  |

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# Multiple Passengers: Aggregate Results

| Passengers per driver                 | 1       | 2       | 3       |
|---------------------------------------|---------|---------|---------|
| Shares                                |         |         |         |
| Transit modal share                   | 24.3 %  | 24.1 %  | 24.0 %  |
| Car modal share                       | 72.4 %  | 71.9%   | 71.8 %  |
| Ridesharing modal share               | 3.3 %   | 4.0 %   | 4.2 %   |
| Surplus                               |         |         |         |
| Total generalized cost (euros)        | -305683 | -368724 | -393185 |
| CO2 emissions reduction (tons of CO2) | 39.372  | 51.145  | 50.373  |
| Road network                          |         |         |         |
| Congestion                            | 20.6 %  | 20.1 %  | 19.6%   |
| Car VKT (10 <sup>3</sup> km)          | 10 595  | 10 534  | 10 538  |

Note: Assuming 30 % of participation in the ridesharing scheme

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#### Concluding remarks:

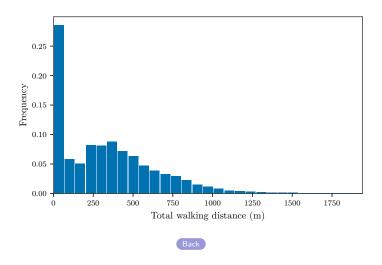
- Ridesharing is an effective tool to reduce congestion and CO2 emissions
- Because of network effects, state intervention through subsidies might be needed to start-up a shift to ridesharing

#### Future works:

- Allowing drivers to make a detour
- Optimal matching minimizing both individual and social costs (e.g., CO2 emissions)
- Considering morning and evening commute together

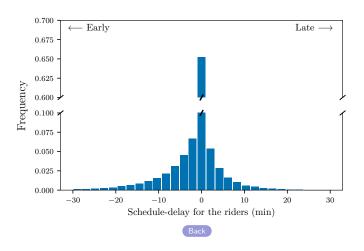
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# Walking Distance



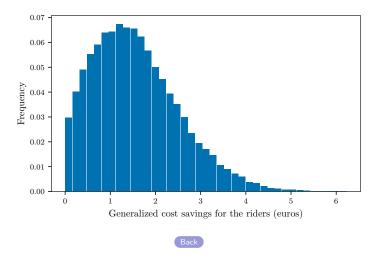
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# Riders' Schedule-Delay



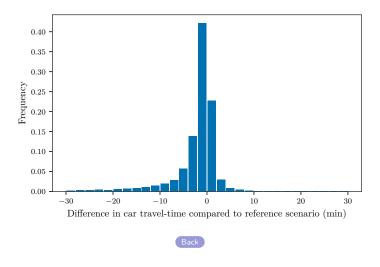
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# Generalized Cost Savings



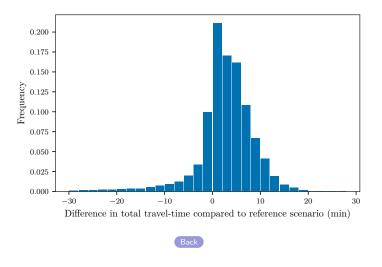
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#### Car Travel-Time Variation



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#### Total Travel-Time Variation



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