

# Evaluation of low traffic neighborhoods: the Paris case study

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# Context

Cities face multiple challenges:

- environmental transition: climate change, air quality
- accessibility: recent focus on local accessibility (15-minute city)
- quality of life

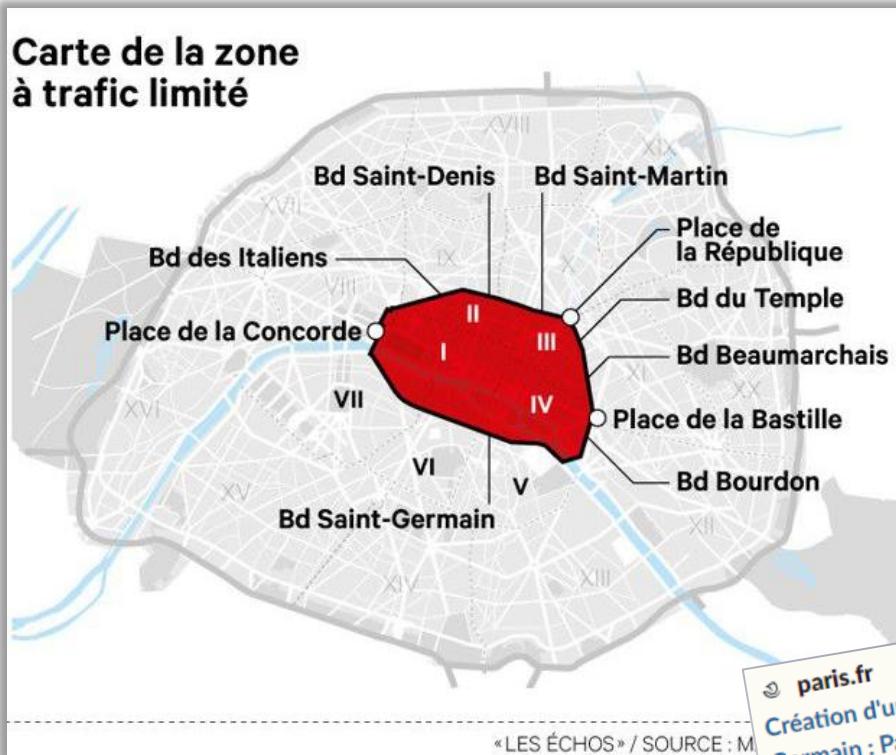
Increasing interest for policies limiting traffic

- low emission zones → air quality
- low-traffic neighborhoods → local accessibility, air quality, climate change

But possible rebound effects?

# The case of Paris

- Contemplated low-traffic neighborhood in 2024



## Les restrictions de circulation automobile dans le centre de Paris repoussées à 2024

D'abord annoncée pour le premier semestre 2022, l'entrée en vigueur d'une « zone apaisée » dans le centre de Paris interviendra finalement en 2024, a annoncé jeudi la mairie. Mais le préfet de police de Paris, Didier Lallement, a exprimé dans la foulée ses « fortes réserves sur le projet tel qu'envisagé ».



paris.fr

**Création d'une zone apaisée Paris Centre - Saint Germain : Paris lance la concertation**  
Et si on ralentissait ? Et si on se réappropriait la ville ? Et si on libérait l'espace public au profit de ceux qui en ont vraiment besoin ? Pour répondre à ces questions, la Ville de Paris lance une consultation sur l'instauration d'une Zone à trafic limité dans la zone Paris Centre - Saint-Germain.

# Outline

**1. Configuration of intermodality**

**2. Calibration**

**3. Paris case study**

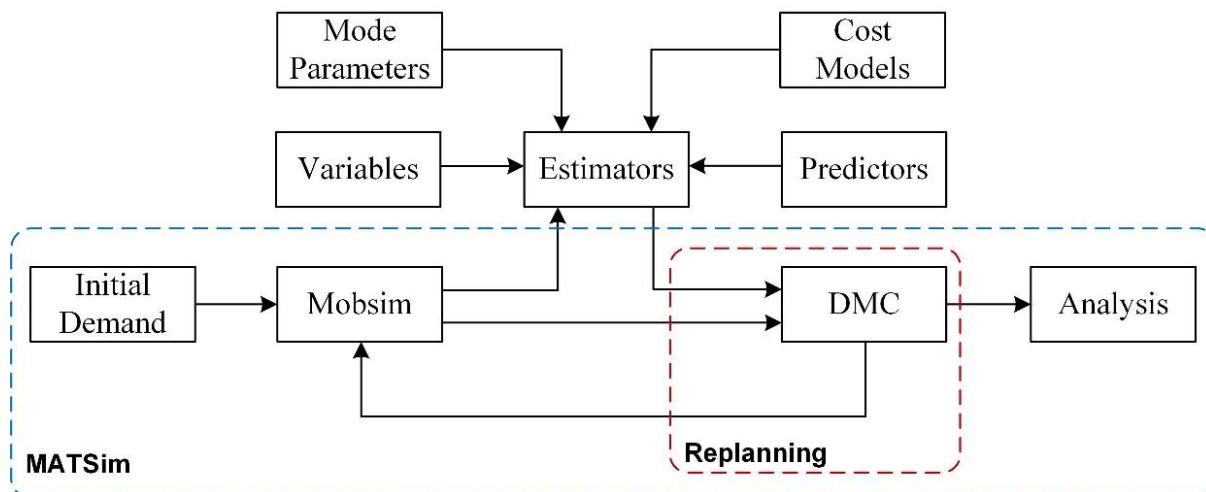
**4. Results**

**5. Discussion and conclusion**

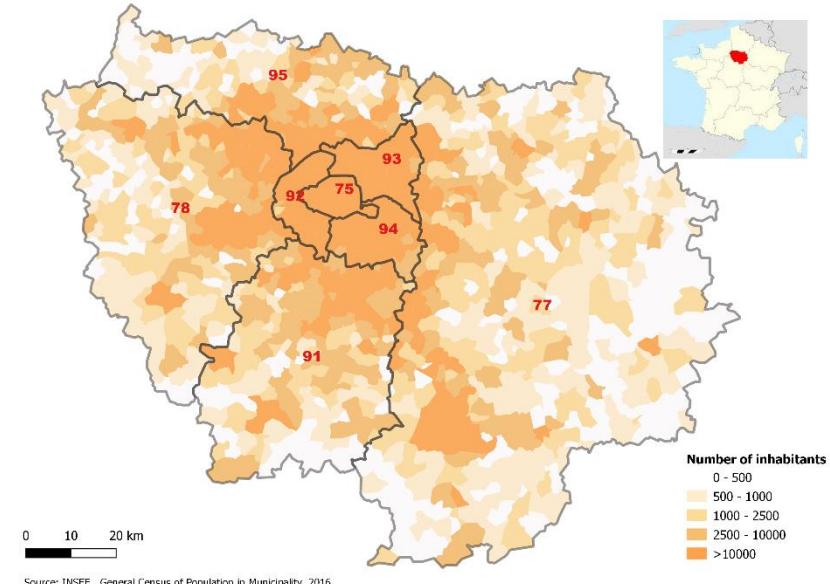
# 1. Configuration of intermodality

## □ Overview of Eqasim

- A novel **Discrete Mode Choice (DMC)** extension under the MATSim framework
- Pipeline of **synthetic population** generation (**Île-de-France**, São Paulo, Los Angeles, etc)
- Calibrated with 2010 HTS (EGT 2010) in Île-de-France scenario
- Open source: <https://github.com/eqasim-org>



Coupling DMC module in MATSim (Hörl and Balac, 2021)



Île-de-France (~12 million inhabitants)

# 1. Configuration of intermodality

## □ Add two forms of intermodalities into Eqasim

### Park & Walk

- Activate **walk-car-walk** trips
  - by setting AccessEgressType. accessEgressModeToLink;
- Compute **accessEgressWalkTime** within a multi-stage car trip

### Park & Ride (Car & PT)

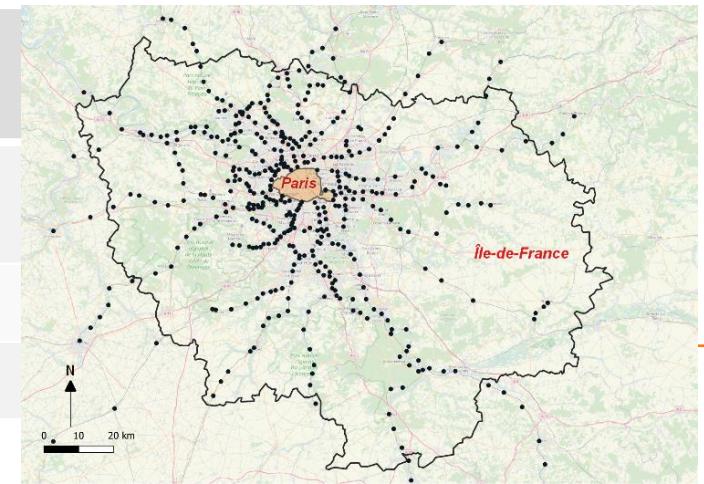
- Adapt the **P&R module** (Diallo's PhD thesis) to Île-de-France scenario
- Create the new **routing modes** of car\_pt and pt\_car with a tour constraint
- Implement **500 P&R facilities** (outside Paris) in Île-de-France

## □ Our scenarios

Scenario	Walk access/egress for car trips	Parking & Ride (Car & PT) trips
Reference_default (Eqasim)	No	No
Reference	Yes	Yes
Driving restriction zone	Yes	Yes

Transport

P&R in Île-de-France



# 1. Configuration of intermodality

## □ DMC utility functions in Île-de-France scenario

$$u_{\text{car}}(\chi) = \alpha_{\text{car}} + \beta_{\text{travelTime,car}} \cdot \chi_{\text{travelTime,car}} + \beta_{\text{travelTime,car}} \cdot \theta_{\text{parkingSearchPenalty}}$$

$$+ \beta_{\text{travelTime,walk}} \cdot \theta_{\text{accessEgressWalkTime}}$$

$$+ \beta_{\text{cost}} \cdot \left( \frac{\chi_{\text{crowflyDistance}}}{\theta_{\text{averageDistance}}} \right)^{\lambda} \cdot \chi_{\text{cost,car}}$$

$$+ \begin{cases} \beta_{\text{inside\_urban,car}} + \beta_{\text{cross\_urban,car}}, & \text{O\&D} \in \text{urban} \\ \beta_{\text{cross\_urban,car}}, & \text{O|D} \in \text{urban} \\ 0, & \text{other} \end{cases}$$
  

$$u_{\text{pt}}(\chi) = \alpha_{\text{pt}} + \beta_{\text{numberOfTransfers}} \cdot \chi_{\text{numberOfTransfers}} + \beta_{\text{inVehicleTime}} \cdot \chi_{\text{inVehicleTime}} + \beta_{\text{transferTime}} \cdot \chi_{\text{transferTime}} + \beta_{\text{accessEgressTime}} \cdot \chi_{\text{accessEgressTime}}$$

$$+ \beta_{\text{cost}} \cdot \left( \frac{\chi_{\text{crowflyDistance}}}{\theta_{\text{averageDistance}}} \right)^{\lambda} \cdot \chi_{\text{cost,pt}}$$
  

$$u_{\text{bike}}(\chi) = \alpha_{\text{bike}} + \beta_{\text{travelTime,bike}} \cdot \chi_{\text{travelTime,bike}} + \beta_{\text{age,bike}} \cdot \max(0, \alpha_{\text{age}} - 18)$$

$$+ \begin{cases} \beta_{\text{inside\_urban,bike}}, & \text{O\&D} \in \text{urban} \\ 0, & \text{other} \end{cases}$$
  

$$u_{\text{walk}}(\chi) = \alpha_{\text{walk}} + \beta_{\text{travelTime,walk}} \cdot \chi_{\text{travelTime,walk}}$$

*With intermodality*

$$u'_{\text{car}}(\chi) = \alpha_{\text{car}} + \beta_{\text{travelTime,car}} \cdot \chi_{\text{travelTime,car}} + \beta_{\text{travelTime,car}} \cdot \theta_{\text{parkingSearchPenalty}}$$

$$+ \beta_{\text{accessEgressWalkTime,car}} \cdot \chi_{\text{accessEgressWalkTime}}$$

$$- \exp \left( \log(101) \frac{\chi_{\text{accessEgressWalkTime}}}{\theta_{\text{walkTimeThreshold}}} \right) + 1$$

$$+ \beta_{\text{cost}} \cdot \left( \frac{\chi_{\text{crowflyDistance}}}{\theta_{\text{averageDistance}}} \right)^{\lambda} \cdot \chi_{\text{cost,car}}$$

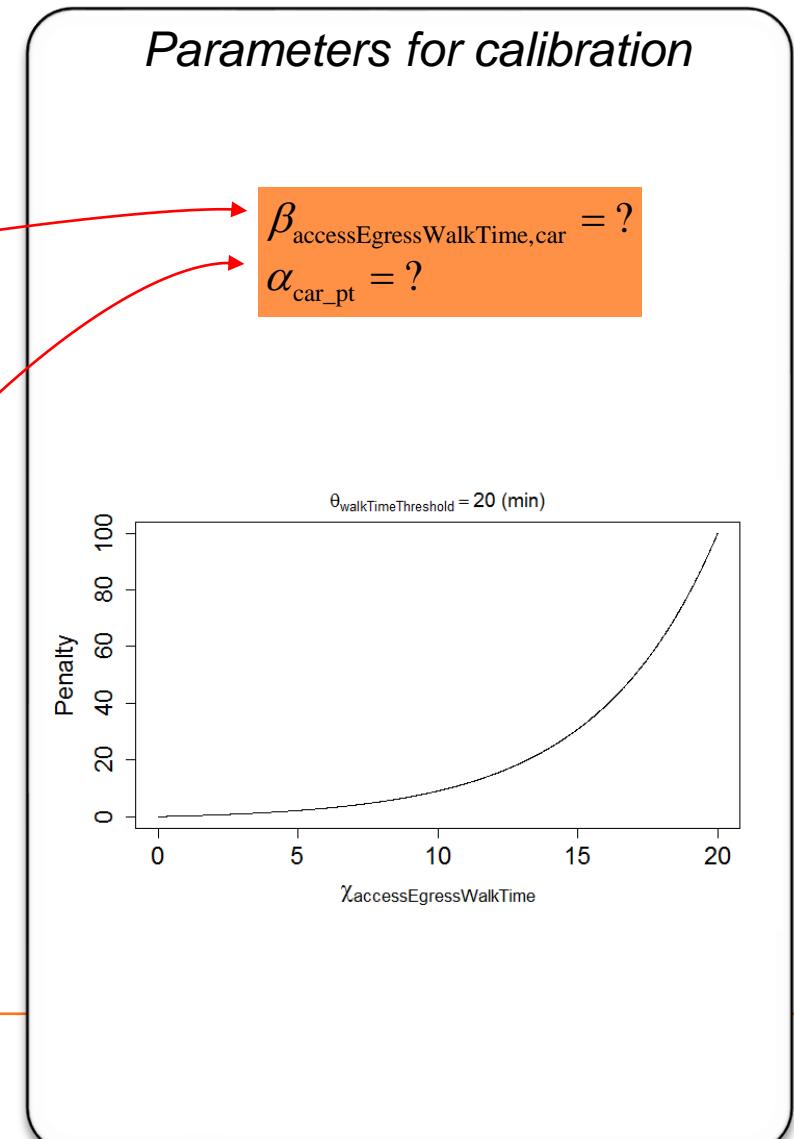
$$+ \begin{cases} \beta_{\text{inside\_urban,car}} + \beta_{\text{cross\_urban,car}}, & \text{O\&D} \in \text{urban} \\ \beta_{\text{cross\_urban,car}}, & \text{O|D} \in \text{urban} \\ 0, & \text{other} \end{cases}$$
  

$$u'_{\text{pt}}(\chi) = u_{\text{pt}}(\chi)$$

$$u'_{\text{bike}}(\chi) = u_{\text{bike}}(\chi)$$

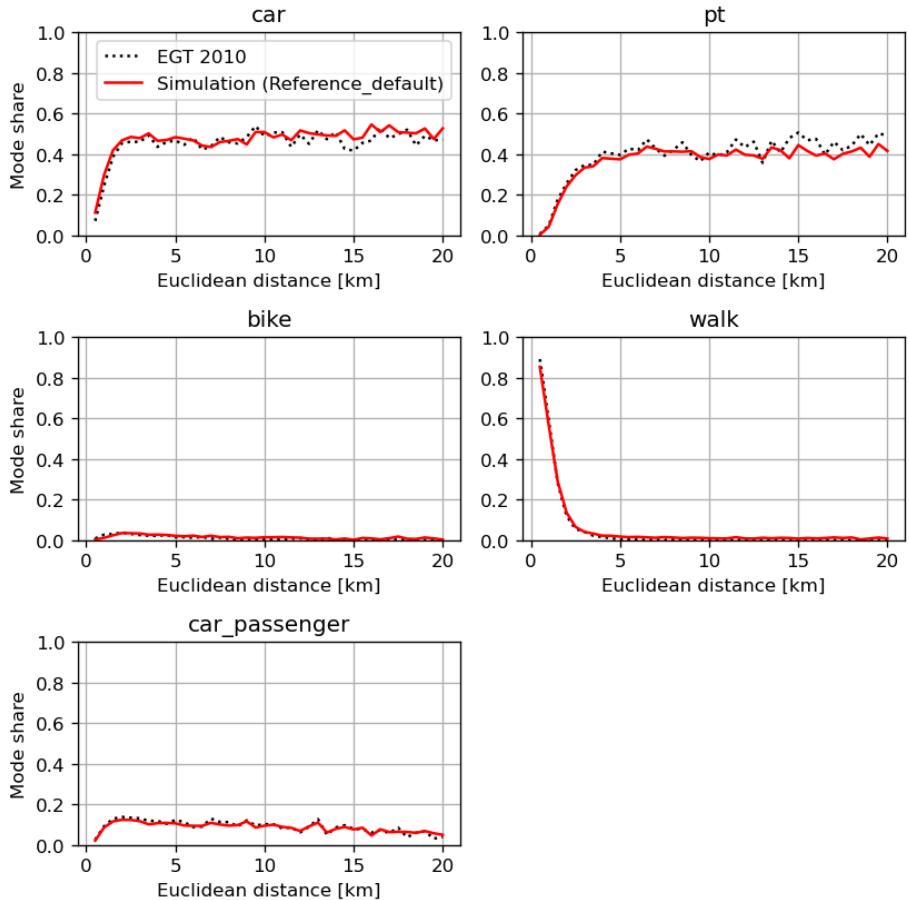
$$u'_{\text{walk}}(\chi) = u_{\text{walk}}(\chi)$$

$$u'_{\text{car\_pt}}(\chi) = \alpha_{\text{car\_pt}} + u'_{\text{car}}(\chi) - \alpha_{\text{car}} + u'_{\text{pt}}(\chi) - \alpha_{\text{pt}}$$



# 2. Calibration

- The two parameter adjustments (1% population in IDF)



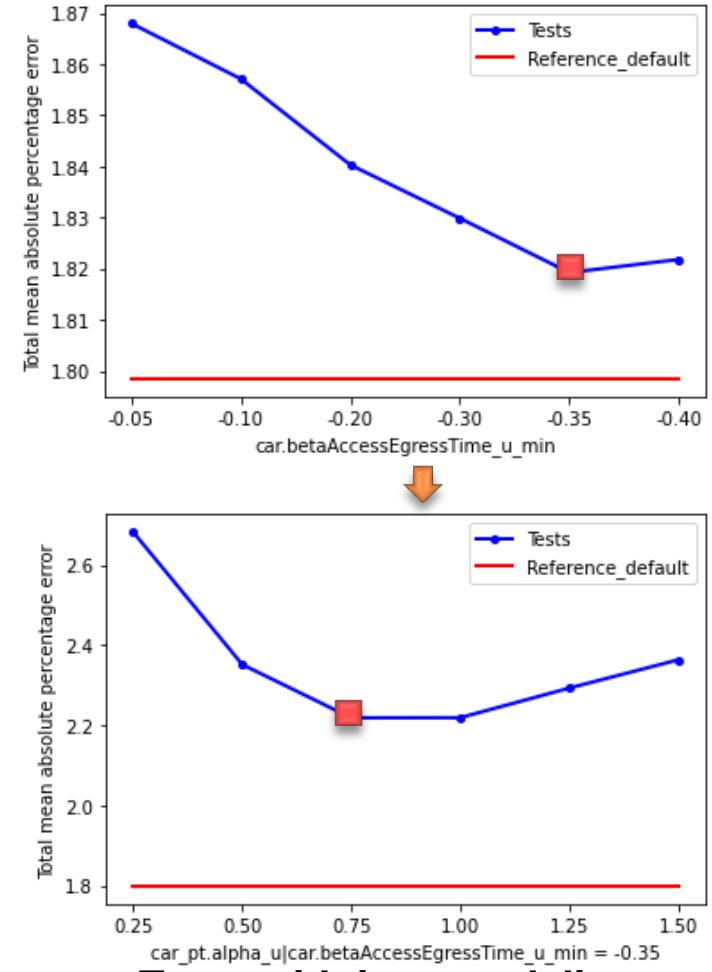
Calibrated modal shares by distance in Île-de-France  
(default: without intermodality)

$$\begin{aligned}\beta_{\text{travelTime,walk}} &= -0.15 \\ (\theta_{\text{accessEgressWalkTime}} &= 4)\end{aligned}$$

$$\text{MAPE} = \sum_i \sum_j \frac{| \text{Sim}_{i,j} - \text{HTS}_{i,j} |}{\text{HTS}_{i,j} |\text{DC}|}, \quad (i \in M, j \in \text{DC})$$



$$\begin{aligned}\alpha_{\text{car}} + \alpha_{\text{pt}} &= 1.35 \\ (\alpha_{\text{car}} &= 1.35, \alpha_{\text{pt}} = 0)\end{aligned}$$

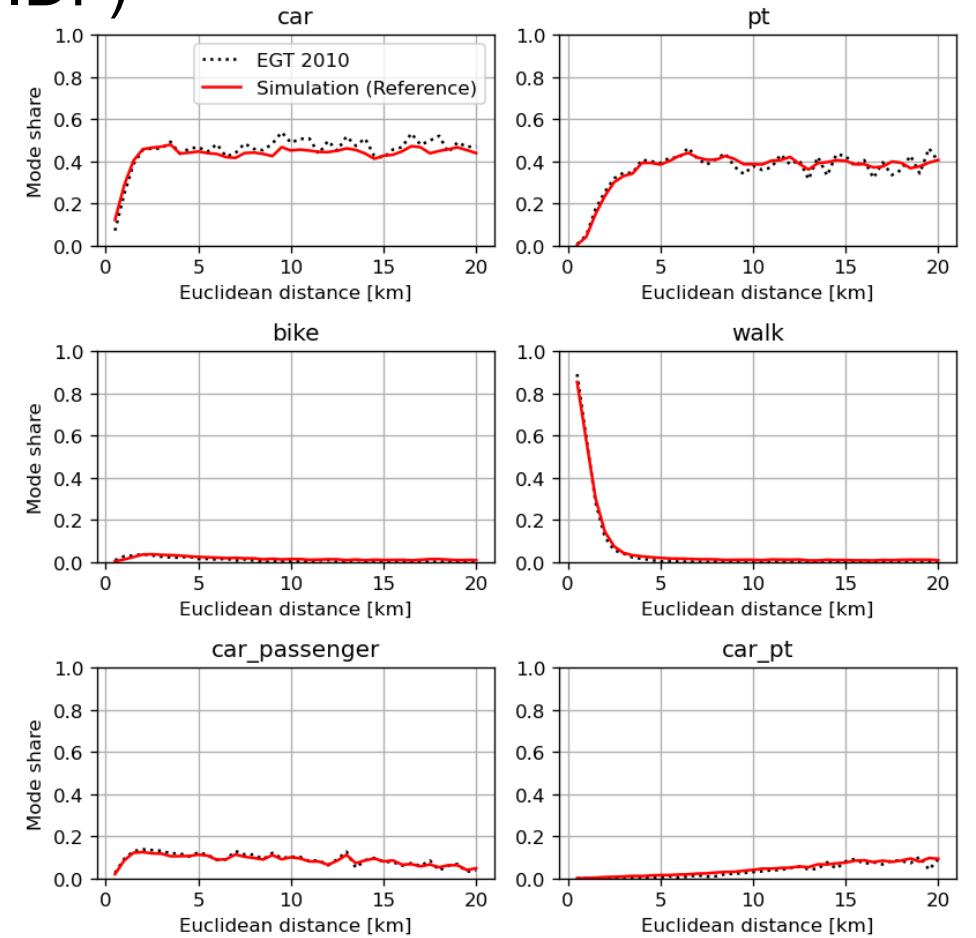
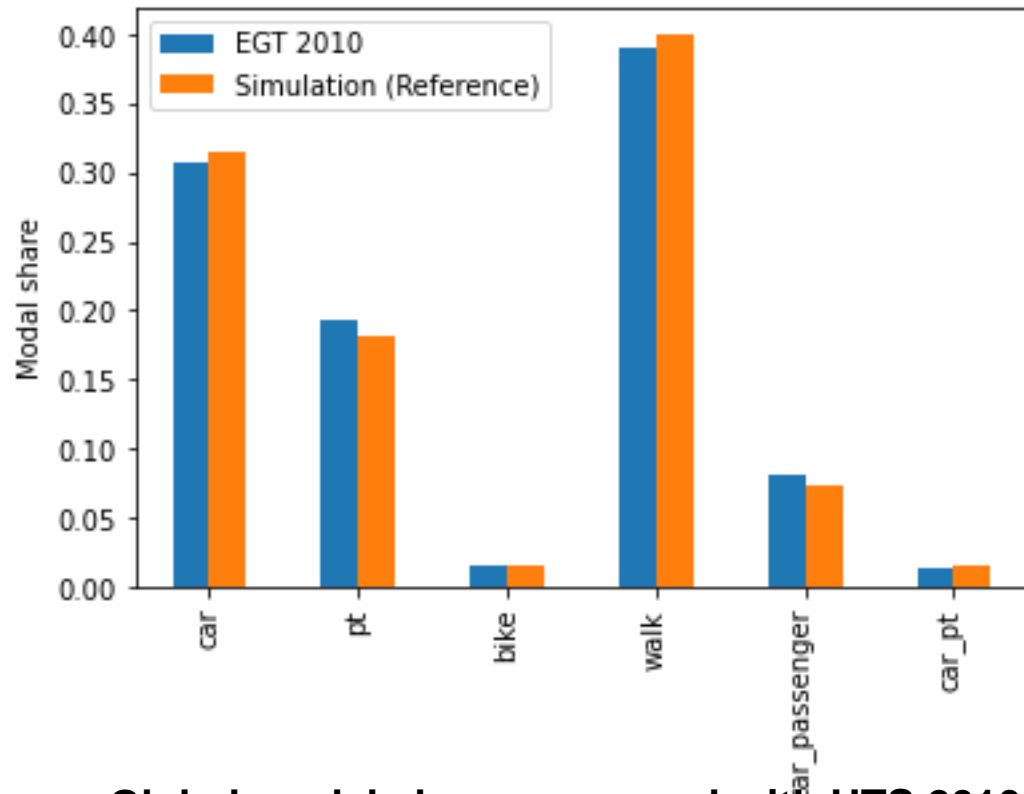


Tests with intermodality

## 2. Calibration

### □ Parameter verification (5% population in IDF)

- car.betaAccessEgressWalkTime = **-0.35**
- car\_pt.alpha = **0.75**



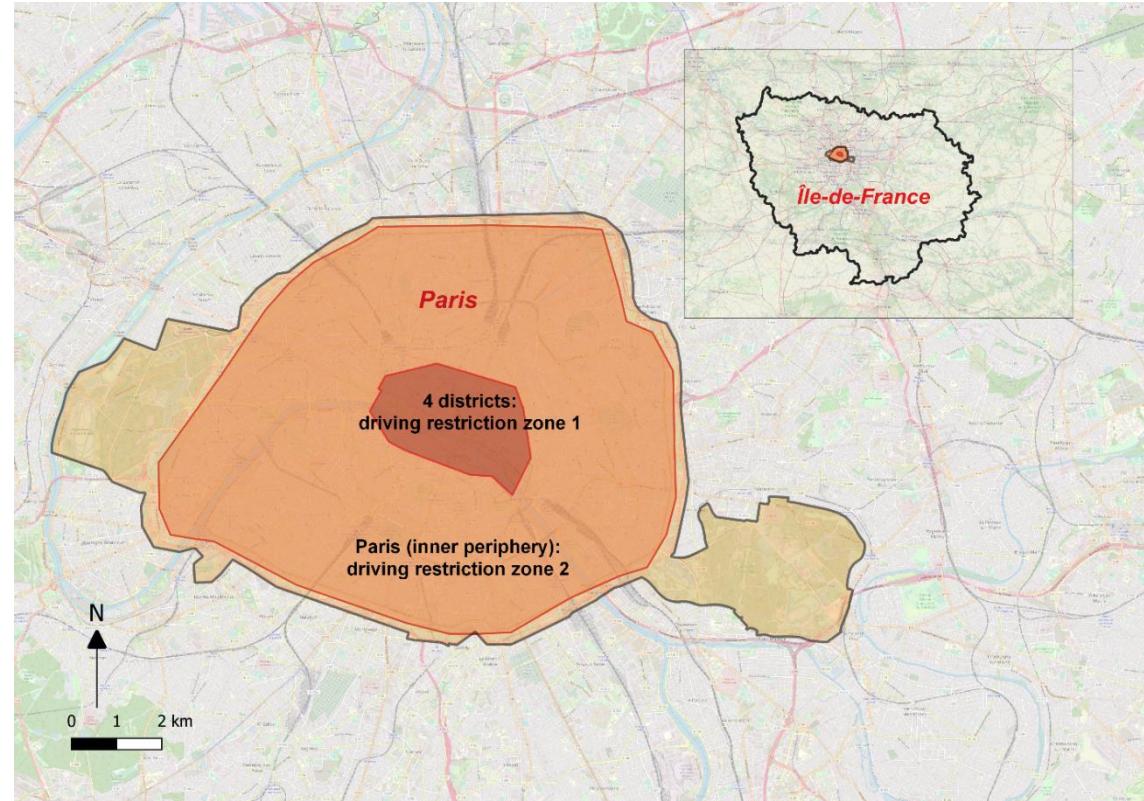
# 3. Paris case study

## □ Scenario

- Case 1: 4 inner districts
- Case 2: all Paris
- Permission:
  - only residents can drive in the zone
  - vehicle type: only passenger cars

## □ Configuration

- Population file: sub-population = resident / non-resident
- Network file: remove “car” from links in DRZ and add “carInternal” for all links
- Mode availability: replace “car” by “carInternal” for residents
- Set carInternal the same attributes as car (parameters in DMC, routing mode, tour constraint, etc.)

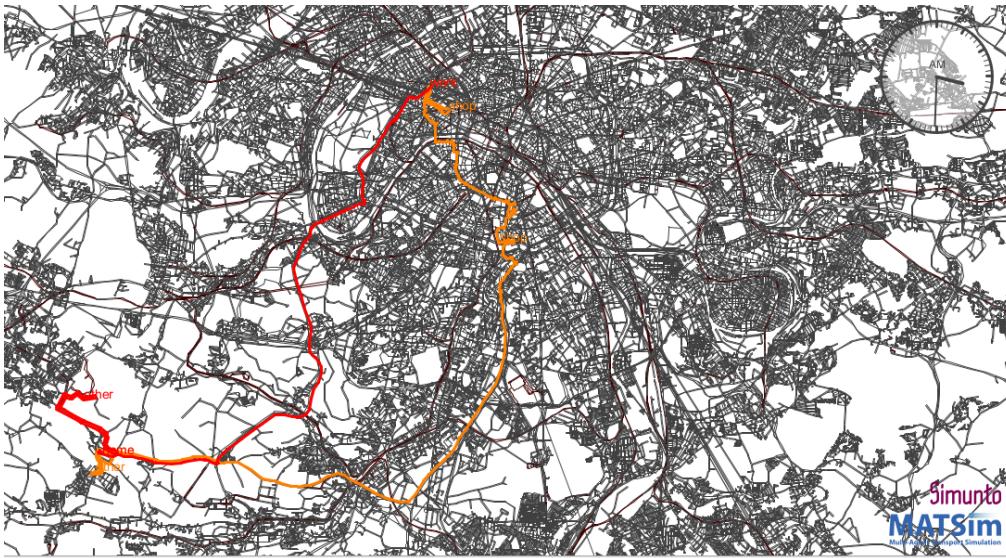


Two cases of driving restriction zone in Paris

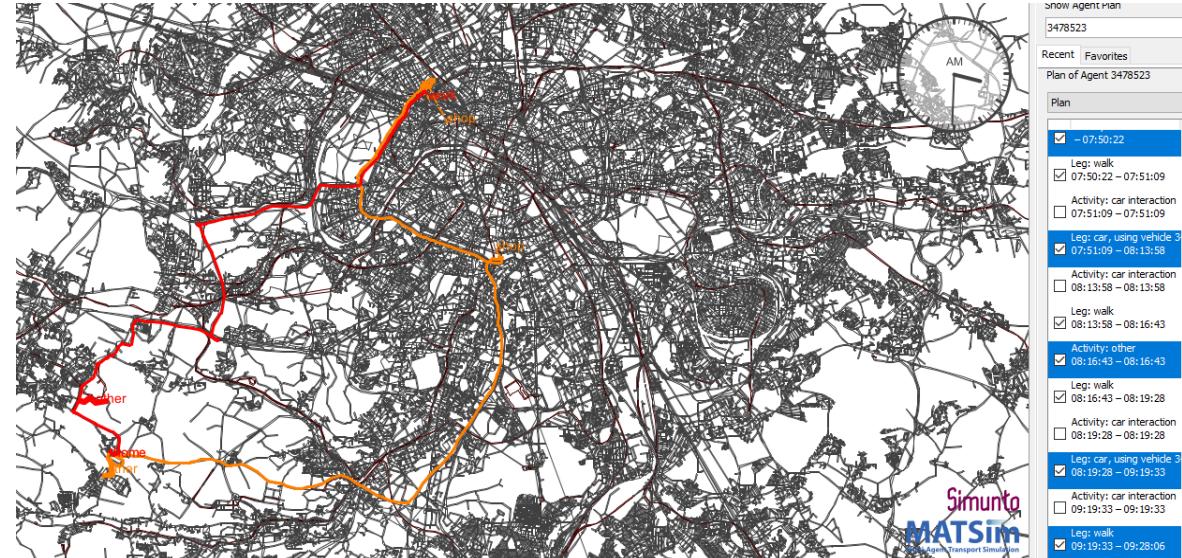
### 3. Paris case study

- Example of travel behaviors before/after driving restriction zone (DRZ) in Paris

The individual who still uses the car: id = 3478523



Before DRZ (car for work)



After DRZ (car for work)

### 3. Paris case study

- Example of travel behaviors before/after DRZ in Paris

The individual who changes the modes: id = 10092238



Before DRZ (car for work)



After DRZ (car+pt for work)

# 4. Results

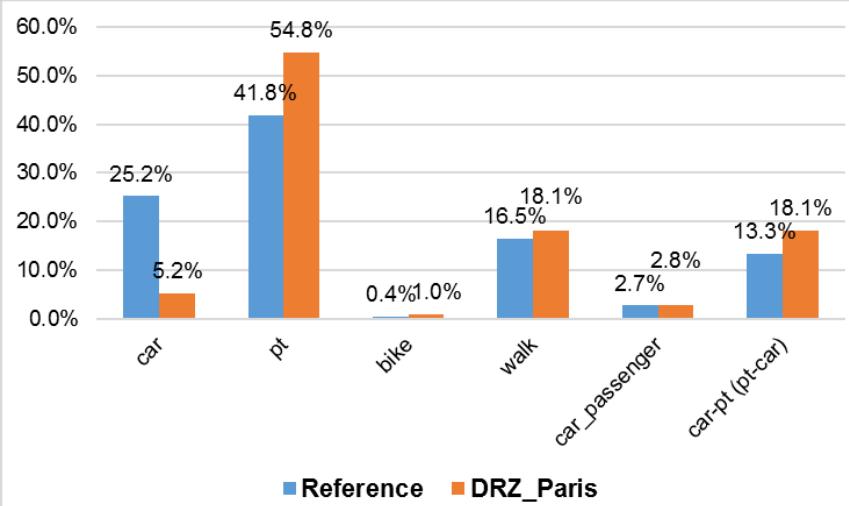
## □ Modal shares

5% population in Île-de-France (~ 2.0 million trips)

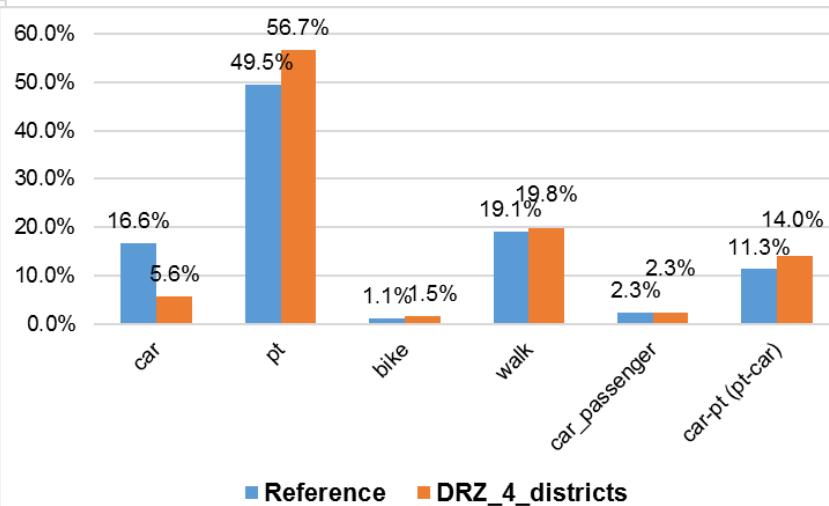
	car	pt	bike	walk	car_passenger	car + pt
Reference	31.5%	18.1%	1.5%	40.0%	7.3%	1.56%
DRZ_4_districts	31.3% (+0.1%*)	18.2%	1.5%	40.1%	7.3%	1.50%
DRZ_Paris	27.8% (+2.3%*)	19.0%	1.5%	40.3%	7.3%	1.73%

\* DRZ residents' carInternal trips

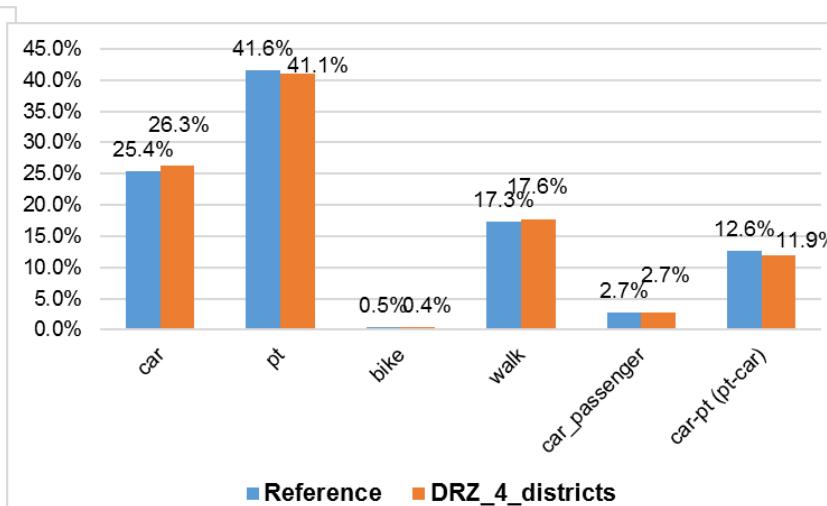
(a)



(b)



(c)

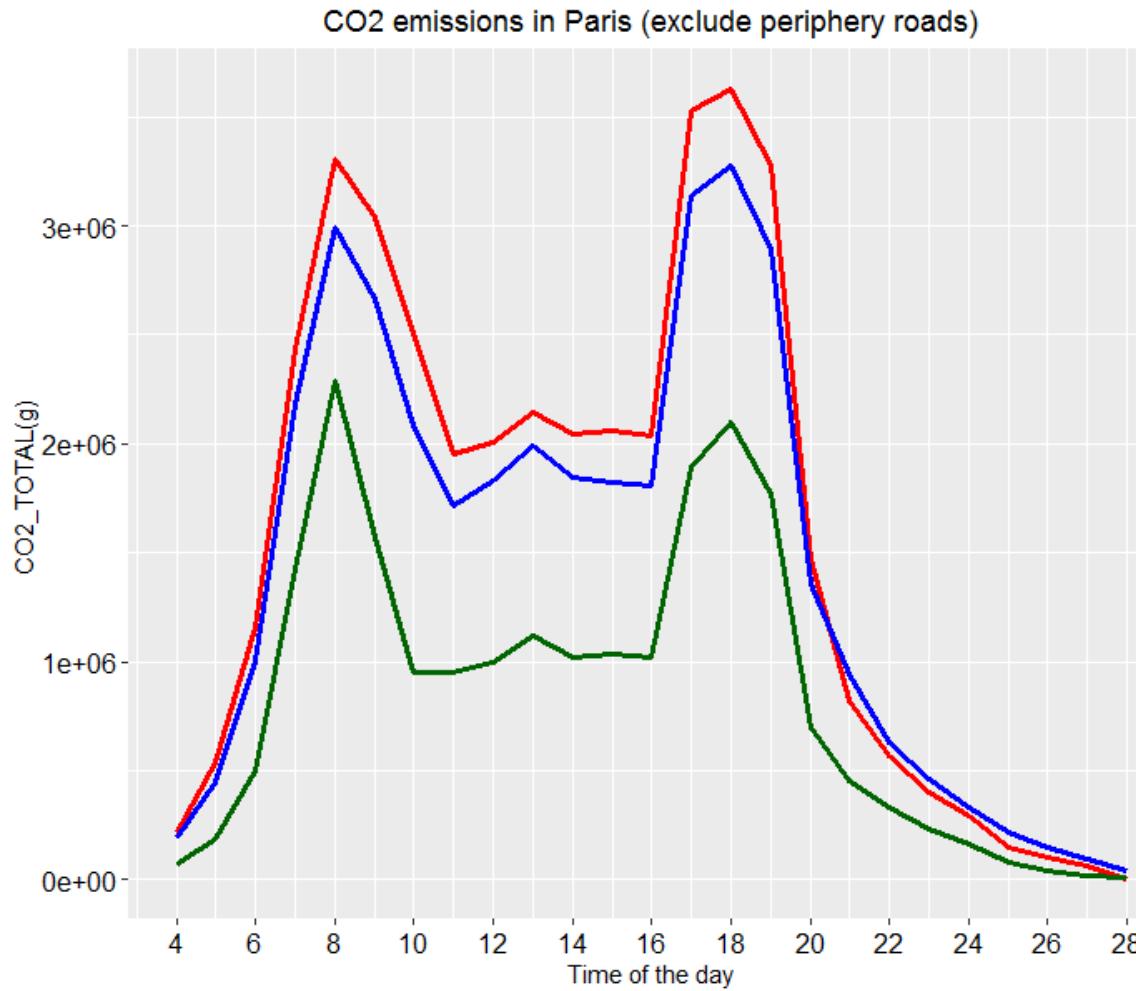


Non-resident commuters with trips associated to (a) Paris (~ 0.1 million trips), (b) 4 districts (~ 17 thousand trips), and (c) between Paris and 4 districts (~ 86 thousand trips)

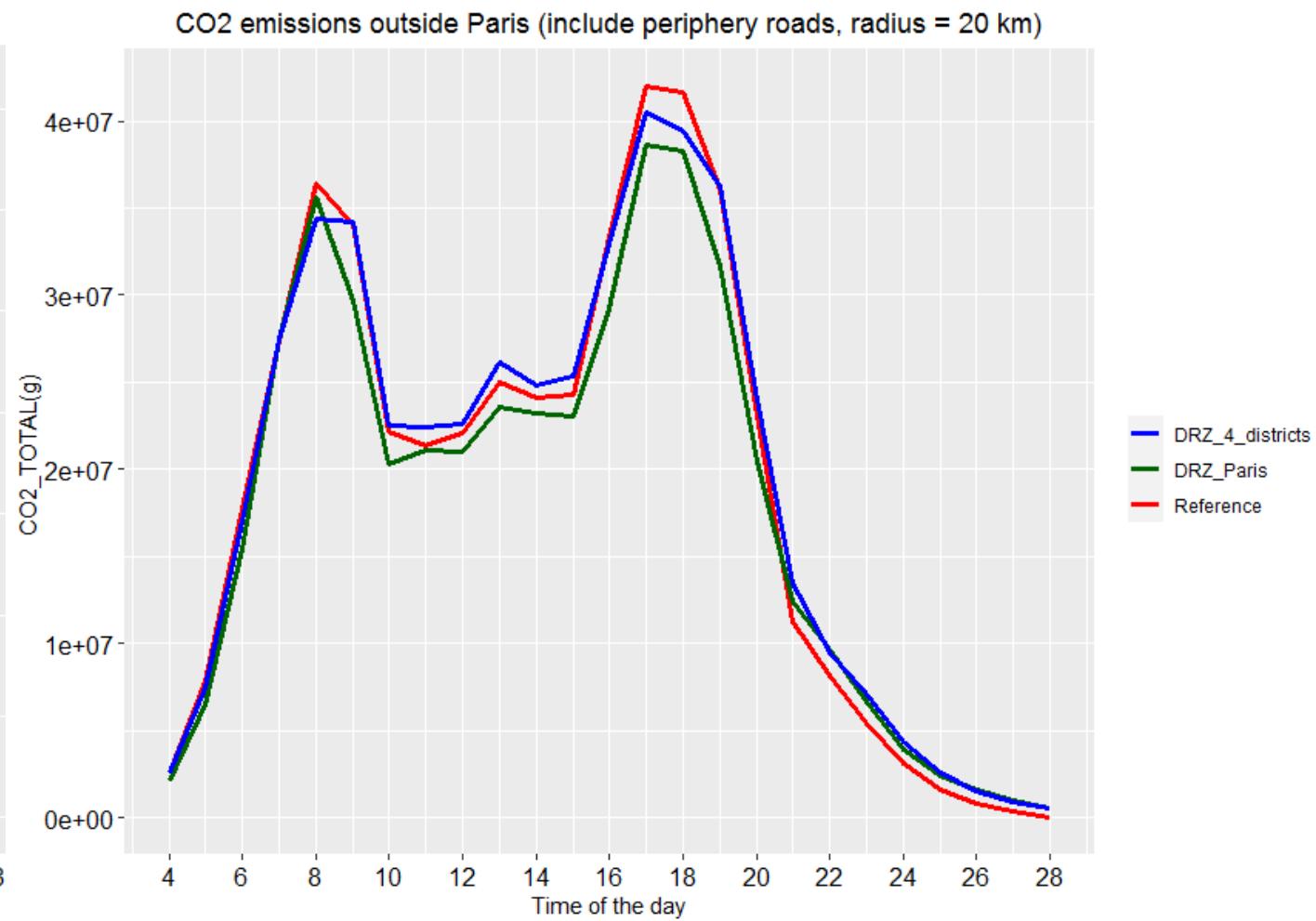
# 4. Results

- CO<sub>2</sub> emissions (based on HBEFA 4.1)

(a) Inside Paris



(b) Outside Paris



# 4. Results

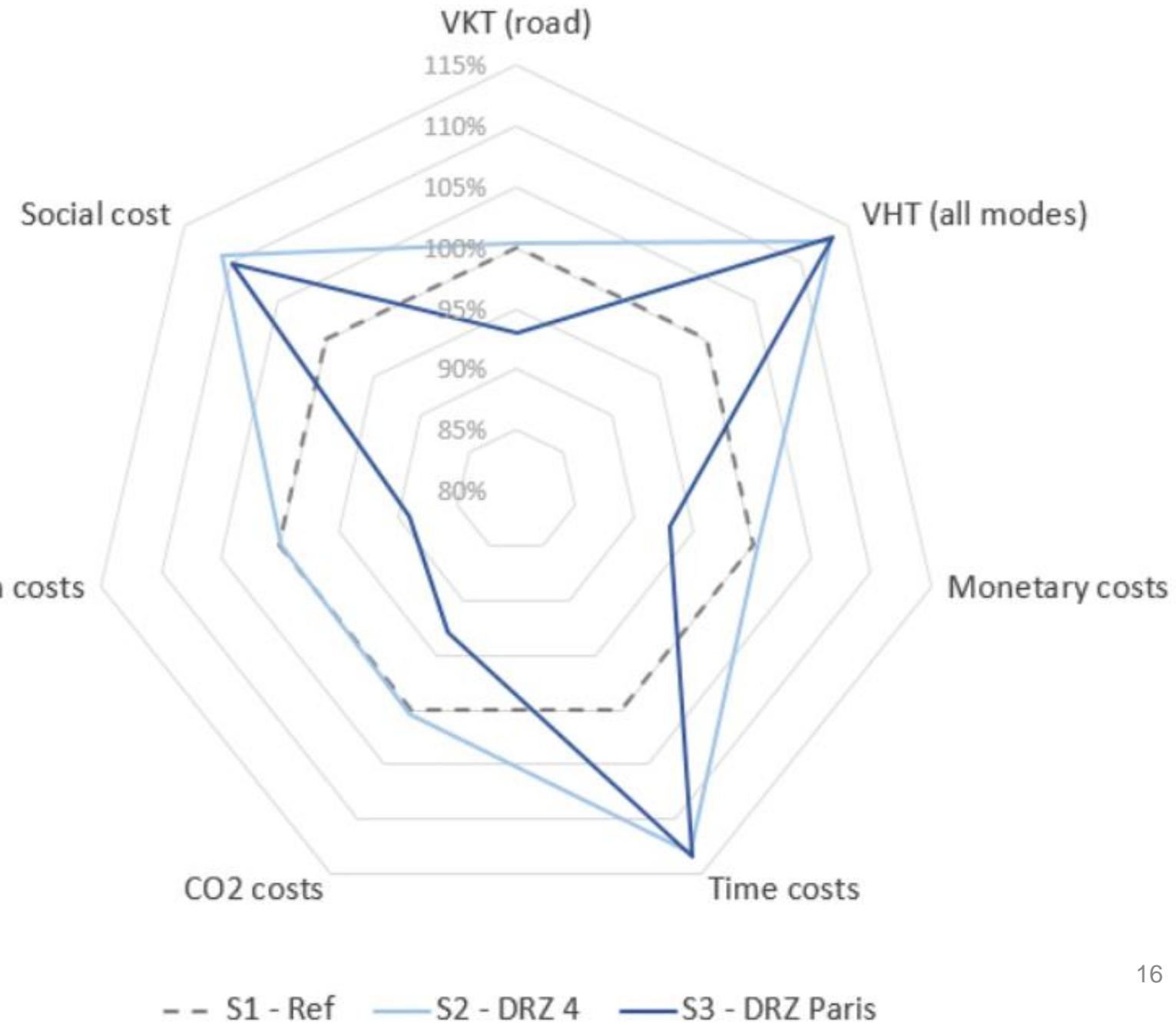
- Air pollutants (g/day)

	Paris region (R<=20 km)	Paris			Outside of Paris (R<=20 km)		
	CO2	NOx	SO2	PM2.5	NOx	SO2	PM2.5
Reference	5.12x10 <sup>8</sup>	1.19x10 <sup>5</sup>	199.67	964.65	1,43x10 <sup>6</sup>	2.37x10 <sup>3</sup>	1.07x10 <sup>4</sup>
DRZ 4 districts	5.17x10 <sup>8</sup> (+1,0%)	1.08x10 <sup>5</sup> (-9,2%)	181.54 (-9,1%)	880.32 (-8,7%)	1,45x10 <sup>6</sup> (+1.8%)	2.41x10 <sup>3</sup> (+1.8%)	1.09x10 <sup>4</sup> (+2.0%)
DRZ Paris	4.67x10 <sup>8</sup> (-8,8%)*	0.61x10 <sup>5</sup> (-48,7%)	105.08 (-48,7%)	546.76 (-47,4%)	1,35x10 <sup>6</sup> (-5.6%)	2.24x10 <sup>3</sup> (-5.5%)	1.02x10 <sup>4</sup> (-4.9%)

\* Values in parenthesis are those compared with reference.

# 4. Results

## Socio-economic KPI



# Equity Analysis

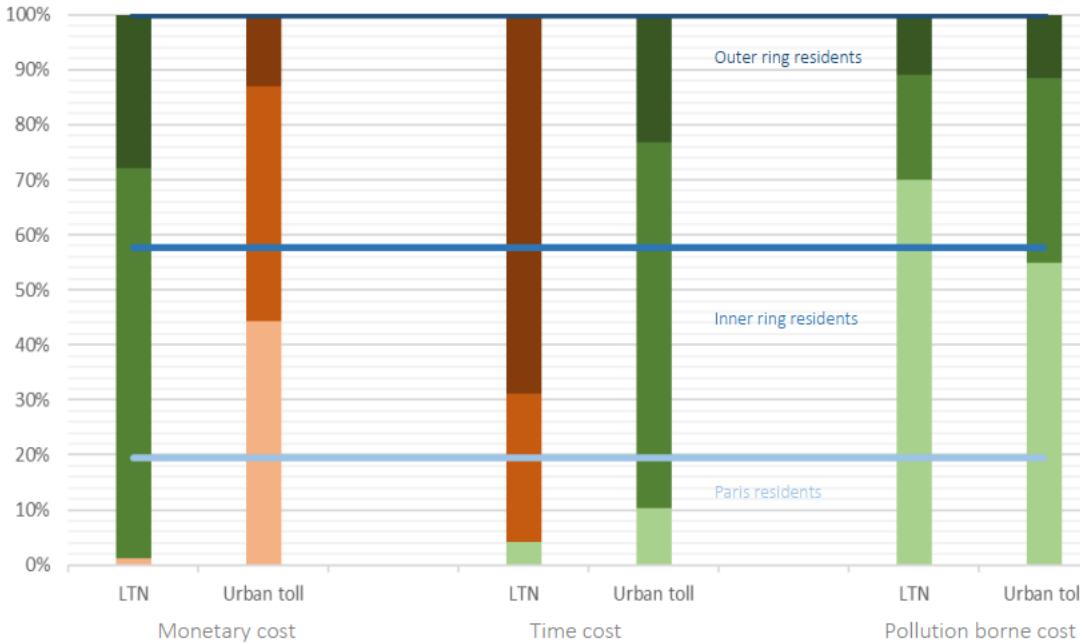
# Results

- A remarkable unequal share of impacts, A priori compensated by another impact
- Paris residents are the main losers from urban toll
- Outer ring residents are the main losers from LTN

Share of impacts per geographical zone

Gain      Paris      Inner ring      Outer ring

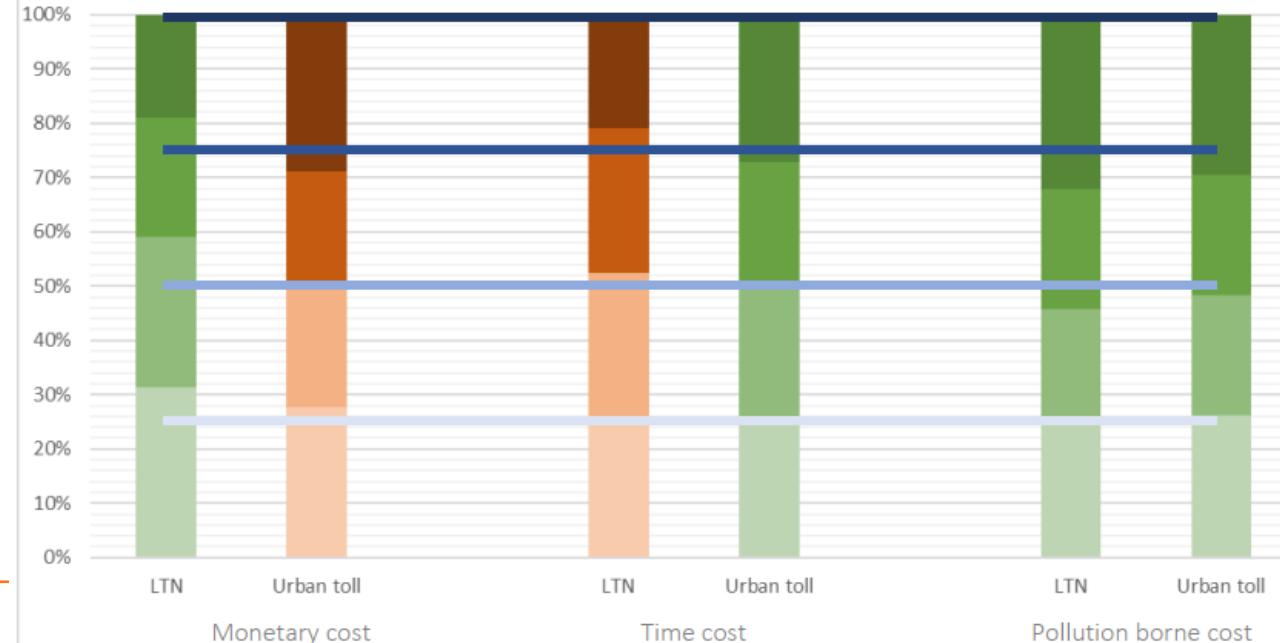
Lost      Paris      Inner ring      Outer ring



Share of impacts per equivalent income quartiles

Gain      Q1      Q2      Q3      Q4

Lost      Q1      Q2      Q3      Q4



# 5. Discussion and conclusion

## □ Main findings

- Projected scenario (4 districts)
  - Limited impact on modal shift, thus negligible environmental benefits
    - Even increase in CO<sub>2</sub> emissions
  - Very costly in terms of time
- Ambitious scenario (Paris)
  - More effective, with substantial environmental benefit
  - For a barely greater time cost than in the previous scenario
  - Increase in social cost
    - A x4 valuation of environmental benefits would be needed to offset the extra time cost
- Impacts greatly vary inside/outside Paris -> equity issues

## □ Future work

- Add parking constraints
  - searching parking locations (road-side lots or garages), capacity limitation and parking fees
- Generalize intermodality with other modes (e.g. micromobility + PT)
- Calibrate parameters with real-time data from GoogleAPI
- Investigate more detailed DRZ policies, e.g., only prohibit passing vehicles (except taxis, buses, emergency and rescue services, ridesharing vehicles, person with reduced mobility)

# **Thank you for your attention!**

## **Questions?**

# 4. Results

- Traffic emissions based on HBEFA 4.1 (before scaling)
  - CO<sub>2</sub> (g/link/day) on the road network

