

## Agent-Based Assessment of the Paris LEZ Policy\* Considering Individual Adaptations

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#### Mobilité durable

#### **AGENDA**

- Introduction
  - General context
  - Research questions
- Methodology and assumptions
- Results
  - Behavioral changes
  - Emissions
- Conclusion and perspectives



#### **GENERAL CONTEXT**

- Transportation and air pollution
  - Responsible for 310 000 premature deaths in Europe each year (EEA, 2020)
  - In France (2019), **51.8% of NO<sub>2</sub>** , **16% of PM2,5** , **11% of CO** , emissions<sup>1</sup>.
- Policy measures to reduce private car use<sup>2</sup>
  - EU-27 aimed through zero pollution action plan to reduce the number of premature deaths due to exposure to fine particulate matter by 55% by 2030, compared to 2005 (EEA, 2022).
  - Encourage the use of public transport (UPPER project)
  - Low emission zones (Gonzalez, J. N., Gomez, J., & Vassallo, J. M. (2022)): Stockholm (Sweden), Berlin (Germany), Paris (France) -
    - 2019 : Crit'Air 4 et 5
    - 2025 : Crit'Air 3 /!\
  - Limit speed reduction: Amsterdam (Netherlands), Paris (France)
    - 2024/10/01: 70 km/h to 50 km/h incoming presentation soon





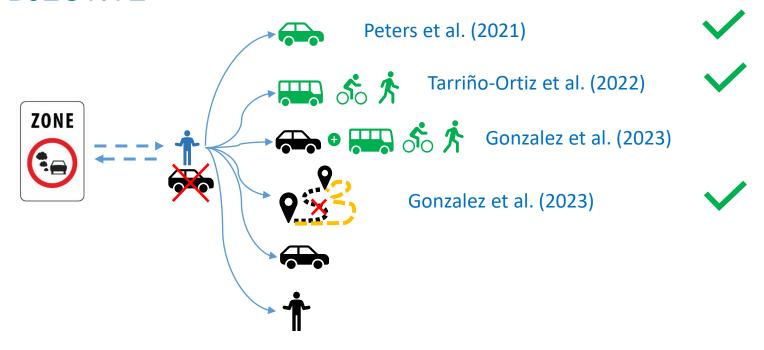


- 1. Source: Citepa, rapport Secten, mai 2020
- . https://urbanaccessregulations.eu/





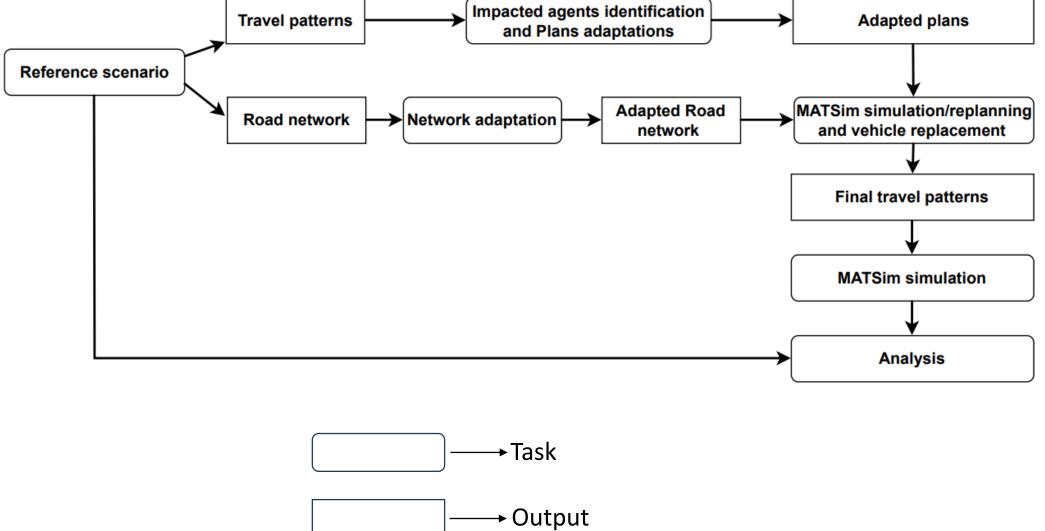
#### RESEARCH OBJECTIVE



- Consider key behavioral changes to ensure the acceptability of the LEZ policy
- Address a gap in simulations studies that often overlooking multiple mobility adaptations (e.g., Yin et al., 2024; Ferreira et al., 2015)
- Use **agent-based simulation** (*MATSim*) to evaluate the Paris LEZ incorporating three behavioral adaptations: vehicle replacement, modal shift, and destination change
  - Simulate agents' adaptations under defined assumptions
  - Provide a multi-scale environmental impact assessment (Paris, VGP, Île-de-France)
  - Conduct a socio-economic analysis of LEZ impact



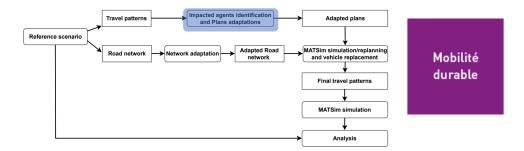
#### **WORKFLOW**

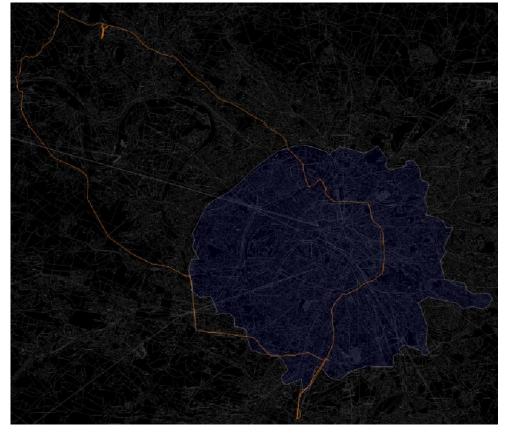




#### **IDENTIFICATION OF IMPACTED AGENT**

- Based-on the reference scenario (without LEZ):
  - Simulation output event (agent\_id, link\_id, time\_step) → routes
  - Transport network (link\_id, geometry)
  - Agents' vehicles fleet (agent\_id, type, energy, Euro norm)
  - LEZ area (geometry)
- Spatial SQL requests to identified agents traveled in the LEZ area with no appropriate vehicle

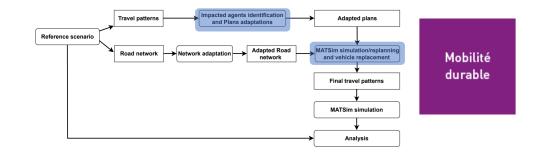






#### Methodology

### PLANS ADAPTATIONS AND REPLANNING STRATEGIES

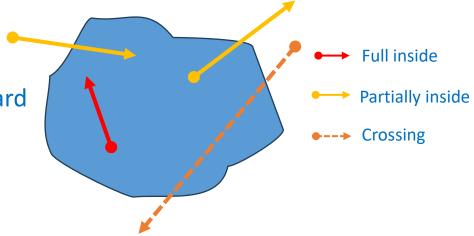


- **●** Three subpopulations with different strategies:
  - lezConformAgent

No impacted agents or whose replaced their forbidden car

Can use their conform vehicle anywhere

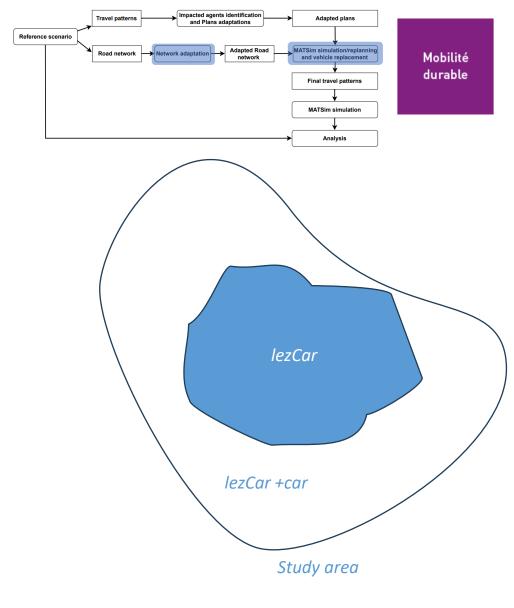
- noConformInsideAgent
  - Impacted agents who perform modal shift from car toward PT, bike, or walk
  - Cannot use car mode anymore (no car+other)
- noLezConformFullCrossingAgent
  - Impacted agents who perform route change
  - Use only car
- Delete all initial links and routes and replace the car by PT within the initial plans





#### NETWORK ADAPTATION AND SIMULATION

- New car mode
  - *lezCar* allowed into the whole network
  - car allowed only outside the LEZ area
- Network modification
  - Delete car mode within all links inside the LEZ area
  - Add lezCar mode into the whole network links
- Simulation
  - Adapting the config file to consider the new replanning strategies





#### NON-COMPLIANT VEHICLE REPLACEMENT

Travel patterns

Impacted agents identification and Plans adaptations

Reference scenario

Road network

Network adaptation

Adapted Road network

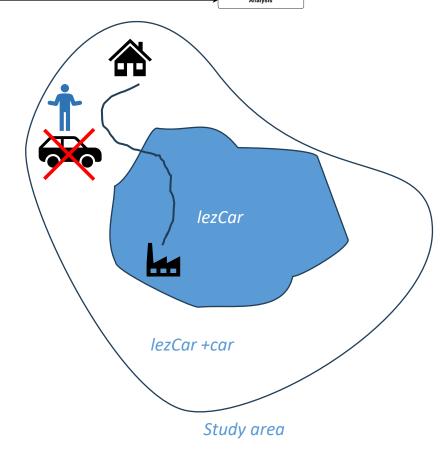
MATSim simulation/replanning and vehicle replacement

MATSim simulation

MATSim simulation

MATSim simulation

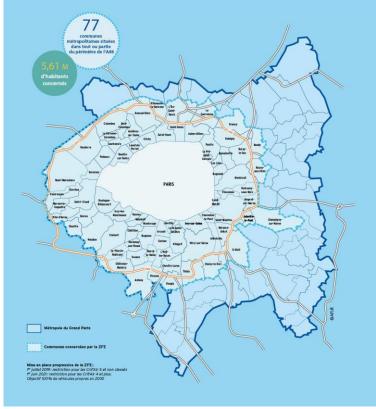
- Based on
  - the replanning simulation output as post-processing step
  - the **remaining compliant** car fleet
- Conditioned by the inability to fully or partially complete daily activities due to
  - Increased travel times from mode shift or rerouting
     →Those are agents likely to replace their banned vehicle and shift into lezConformAgent sub-population
- Assumptions & Constraints
  - PT travel time ratio threshold (PT time / car time) ≤ 2.7 (Leviaux & Péguy (2022))
  - Avoid exceed travel time (<=75th percentile) for PT (<60 min), bike (30 min) or walking (<15 min)</p>





#### PARIS LOW EMISSION ZONE

- In France, cities where pollutant emissions thresholds defined by WHO are exceeded must implement a <del>Low</del> <del>Emission Zone (LEZ)</del>
- In Paris, the LEZ legislation\* includes
  - a perimeter and times slots where vehicles circulation is restricted,
  - a schedule for future restrictions,
  - and exemptions.
- The classification of vehicles in LEZ is determined by the Crit'Air system, which itself is based on the vehicle's Euro emission standard
  - Next vehicles restrictions is C3 (Gasoline Euro 2 & 3 Diesel Euro 4) in 2025 /!\





\* https://metropolegrandparis.fr/fr/la-zone-faibles-emissions-metropolitaine

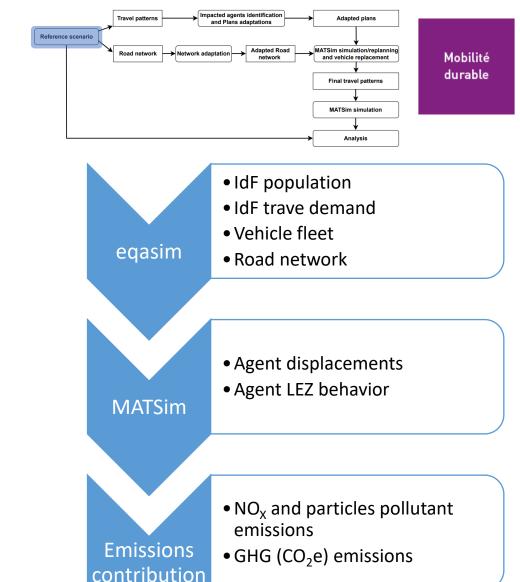




#### SIMULATION FRAMEWORK

- eqasim generates Ile-de-France\* population, travel demand and light vehicle fleet
  - The approach allows to assign a vehicle to each agent while retaining an age and energy distribution
- ■MATSim simulates behavioral adaptations in response to the LEZ
- MATSim emissions module coupled with HBEFA computes pollutant (NO<sub>X</sub> and particles) and GHG (CO<sub>2</sub>) emissions

<sup>\*</sup>Hörl, S. and M. Balac (2021) Synthetic population and travel demand for Paris and Île-de-France based on open and publicly available data, Transportation Research Part C, 130, 103291.



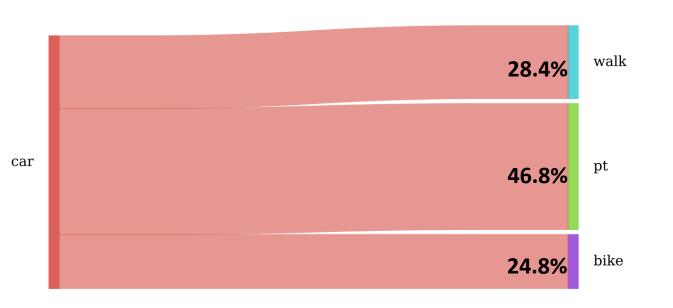


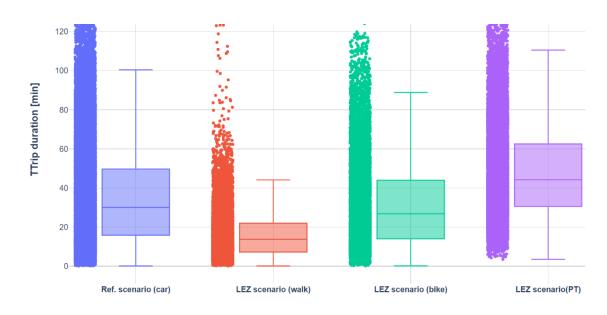


#### **BEHAVIORAL CHANGES**

# Reference scenario Reference scenario Road network Network adaptation Adapted Road network MATSim simulation/replanning and vehicle replacement Final travel patterns MATSim simulation Analysis

#### • noConformInsideAgent sub-population

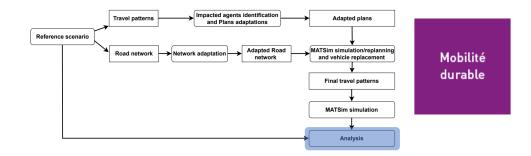




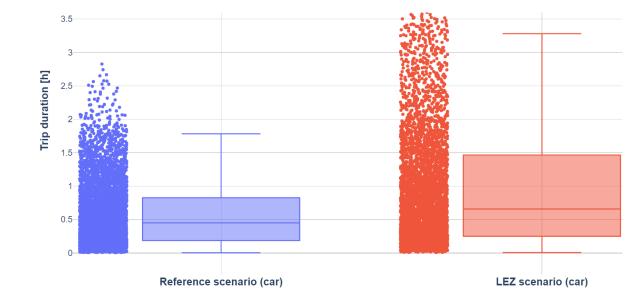
- After applying constraints complete daily activities
  - 3%, 9%, and 15% shifted to wtoalking, cycling, and public transport (PT), respectively
  - 73% remaining replaced their non-compliant vehicle



#### **BEHAVIORAL CHANGES**

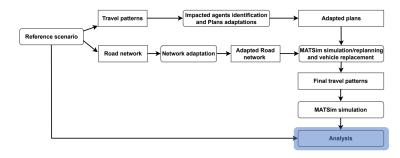


- noLezConformFullCrossingAgent subpopulation
  - 94% of agents who avoided the restricted zone kept their non-compliant vehicles
  - Only 6% chose to replace





#### **EMISSIONS**





	LEZ area			MGP			IdF		
	$NO_x$	PM2.5	$CO_2$	$NO_x$	PM2.5	$CO_2$	$NO_x$	PM2.5	$CO_2$
Ref. scena.	12	0.3	6,274	13.8	0.3	7,108	32.2	0.8	15,644
LEZ scena.	9.9	0.07	5,954	11.5	0.13	6,901	30	0.5	$15,\!420$
Variation (%)	-17.8	-74.2	-5.1	-15.2	-62.2	-3	-6.8	-41.3	-1.4

- Larger LEZ areas lead to greater overall emission reductions
- Particulate matter (PM) emissions show the most significant decrease, compared to NOx and CO₂
- This is largely due to the ban on Diesel Euro 4 vehicles, which:
  - represent 10% of the vehicle fleet
  - Contribute to 80% of PM emissions



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#### CONCLUSION

- Paris LEZ Policy (2025) Assessment via Agent-Based Simulation (MATSim)
  - Focusing on three key behavioral adaptations: Vehicle replacement, Modal shift (PT, bike, walking), Route change
  - Modeled through specific agent sub-populations
- Key Finding: Banning Diesel Euro 4 vehicles (10% of fleet) leads to a major reduction in particle emissions (80% of PM sources)

#### • Limitations:

- Does not capture psychological/latent factors (opinions, perceptions, attitudes) → cf.
   Morton et al. (2021)
- Assumes agents always adapt no trip abandonment or fraud (e.g., non-compliant use)

#### Perspectives:

- Integrate population and car fleet evolution and new PT lines over time
- Integrate intermodal alternatives (Yin et al. (2024)), trip abandonment, and fraud
- Extend to geographic and temporal restrictions (Versailles Grand Parc)
- Perform localized emissions analysis (e.g., LEZ periphery rebound effects)



#### THANK YOU FOR LISTENING!



https://www.brusselstimes.com/44817/belgium-s-slow-war-against-diesel-cars



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