

# Integrating housing and transport interactions: A strategic dynamic approach

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June 10, 2025



EPFL

# Overview

- 1 Motivation
- 2 Literature
- 3 Framework
- 4 Model and methodology
- 5 Application
- 6 To conclude and future work

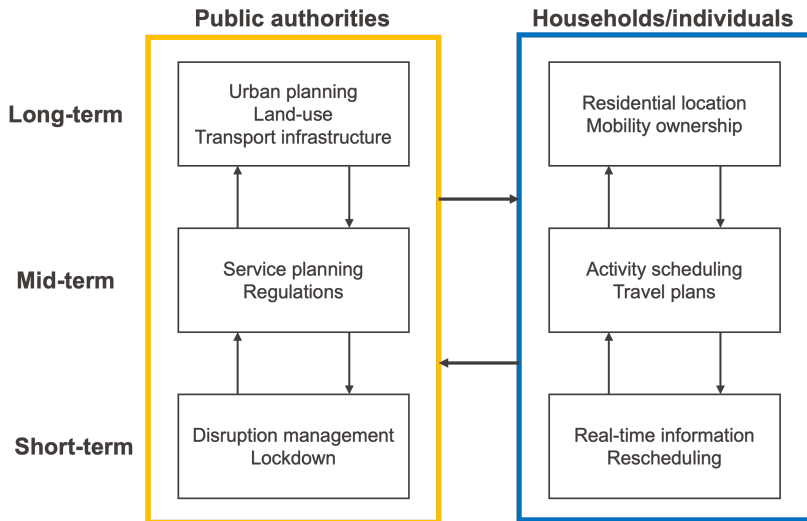


# Urban systems and choices

- Think of an urban area where people are living in.
- In urban context, there are a combination of choices:
  - Different time horizons.
  - Choices of household/individuals.
  - Choices of public authorities.

Thus, there are various decisions made at different temporal, spatial, and hierarchical level.

# Choices and decisions





# Introduction

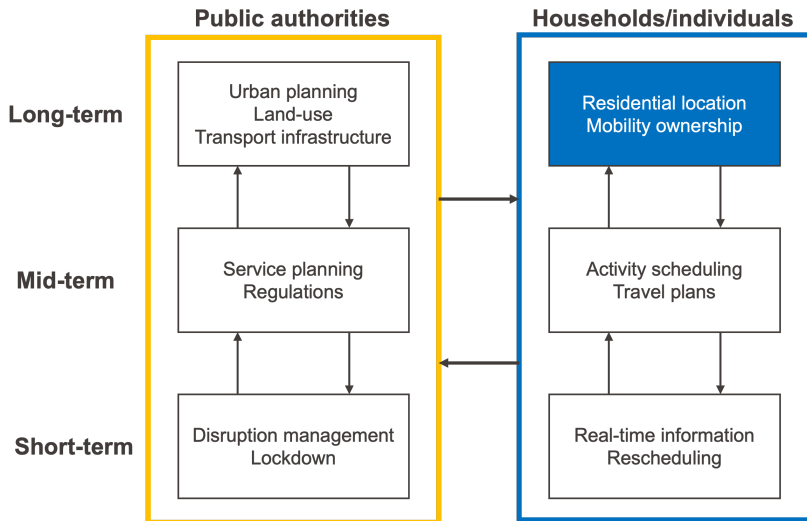
- **Challenges** stemming from the interplay of **transport** and **land-use** developments, such as:
  - Congestion,
  - Accessibility issues,
  - Increasing housing prices,
  - Housing shortage,
  - Relocation of residents.
- Effective urban/regional planning demands an **indicative tools** with capability to inform likely development **paths** under different scenarios, **over time**.

Thus, for a **structured policy decision-making process**, we need a **comprehensive model** accounting for these spatial and temporal interrelations over time.

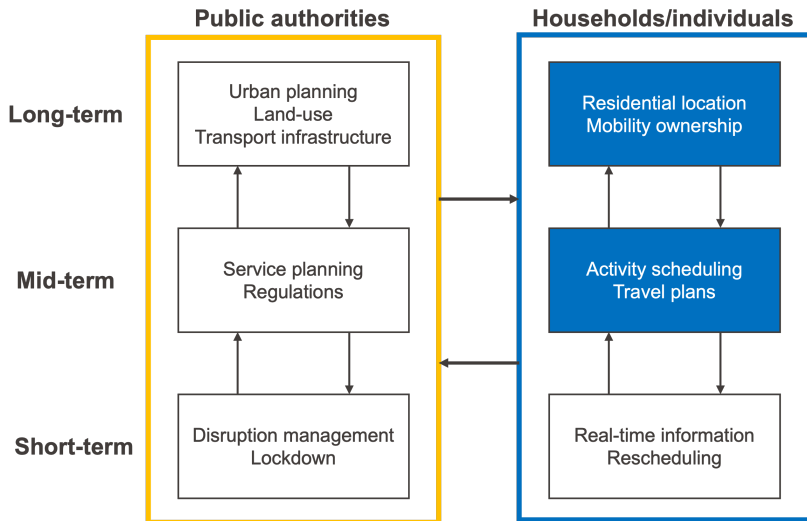
# Motivation

- Case of Luxembourg; high economic development, population growth (migration, cross-borders), housing price, traffic.
- To address these challenges, understanding the **complex system** and **jointly** developing **housing** and **transport** developments, and their relevant **feedbacks** is required.
- Adding **spatial** dimension at canton-level into economic models, particularly integrating residential location and transportation endogenously in the model.
- An **efficient decision support** for potential **policy interventions**.

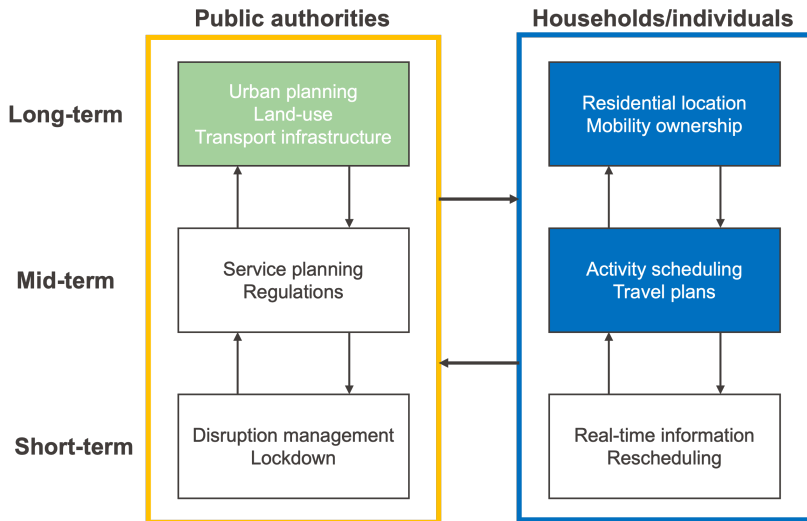
# Choices and decisions



# Choices and decisions



# Choices and decisions



# Literature review

- Land-use treated exogenously in traditional transport models.
- Multiple approaches to model transport across land-use models:

Model	Disaggregate	Aggregate
Static	<ul style="list-style-type: none"> <li>• Discrete choice models (Bhat &amp; Guo 2007, Ben-Akiva &amp; Bowman 1998, Lerman 1976)</li> <li>• Ground-truth (Swisstopo)</li> </ul>	<ul style="list-style-type: none"> <li>• Spatial computable general equilibrium (Tscharaktschiew &amp; Hirte 2012)</li> </ul>
Dynamic	<ul style="list-style-type: none"> <li>• Microsimulation (e.g., UrbanSim (Waddell 2002), ILUTE (SALVINI &amp; MILLER 2005))</li> </ul>	<ul style="list-style-type: none"> <li>• Dynamic spatial equilibrium (Lennox 2023)</li> <li>• System dynamics (Pfaffenbichler et al. 2008)</li> <li>• Spatial interaction (Lopane et al. 2023)</li> <li>• Flow-based rules (e.g., Delta (Feldman &amp; Simmonds 2014))</li> </ul>

- *Static models do not model time evolution.*
- *Dynamic models simulate temporal feedback and trajectories.*

# A Comparison of modelling approaches

Model	Disaggregate	Aggregate
Static	<ul style="list-style-type: none"> <li>• + Captures heterogeneity.</li> <li>• + Useful for immediate impacts.</li> <li>• – No path evolution over time.</li> </ul>	<ul style="list-style-type: none"> <li>• + Suitable for equilibrium policy analysis.</li> <li>• – Ignores dynamics and temporal feedback.</li> </ul>
Dynamic	<ul style="list-style-type: none"> <li>• + Captures heterogeneity.</li> <li>• + Captures adaptive and path-dependent behaviour.</li> <li>• + Suitable for long-term scenarios.</li> <li>• – High model complexity.</li> <li>• – Long run times.</li> <li>• – Data-intensive.</li> </ul>	<ul style="list-style-type: none"> <li>• + Models macroeconomic trends and system-level feedback.</li> <li>• + Effective for strategic appraisal.</li> <li>• + Computationally efficient.</li> <li>• + Data requirement.</li> <li>• – Coarse spatial and social heterogeneity.</li> </ul>

# Aggregate dynamic approach

Model	Disaggregate	Aggregate
Static	<ul style="list-style-type: none"> <li>+ Captures heterogeneity.</li> <li>+ Useful for immediate impacts.</li> <li>- No path evolution over time.</li> </ul>	<ul style="list-style-type: none"> <li>+ Suitable for equilibrium policy analysis.</li> <li>- Ignores dynamics and temporal feedback.</li> </ul>
Dynamic	<p>scenarios.</p> <ul style="list-style-type: none"> <li>- High model complexity.</li> <li>- Long run times.</li> <li>- Data requirement.</li> </ul>	<p>appraisal.</p> <ul style="list-style-type: none"> <li>+ Computationally efficient.</li> <li>+ Data requirement.</li> <li>- Coarse spatial and social heterogeneity.</li> </ul>

**System thinking and Dynamic modelling**  
 well-suited for complex systems that changes over time, due to their ability to model **feedback, delays, and dynamic adaptation.**

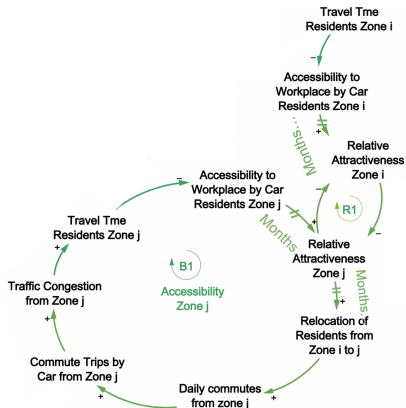


# Causal loops

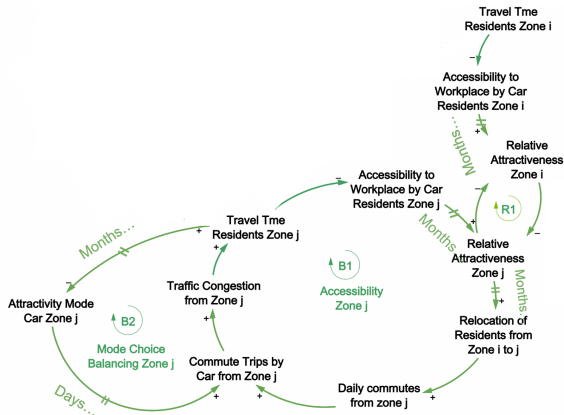
- Help tell a story about the system.
- Easily illustrates the mental model.
- Communicate the important feedbacks.



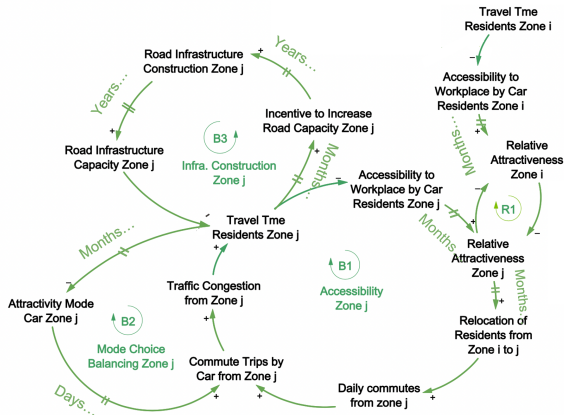
# Causal loops in transport



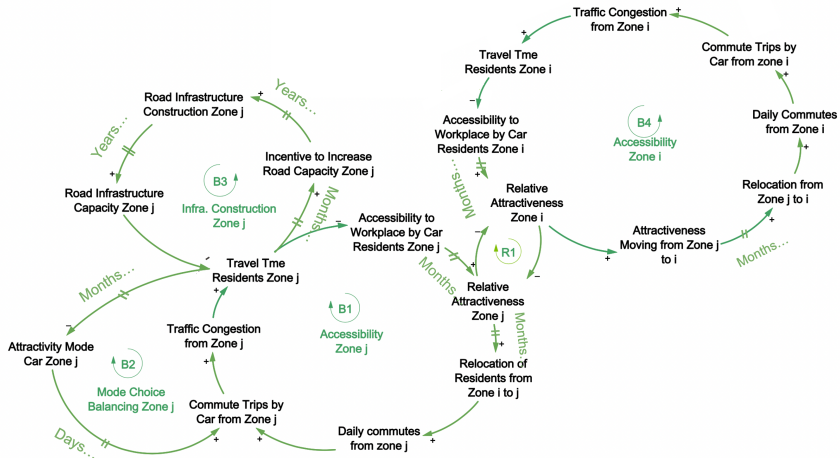
# Causal loops in transport



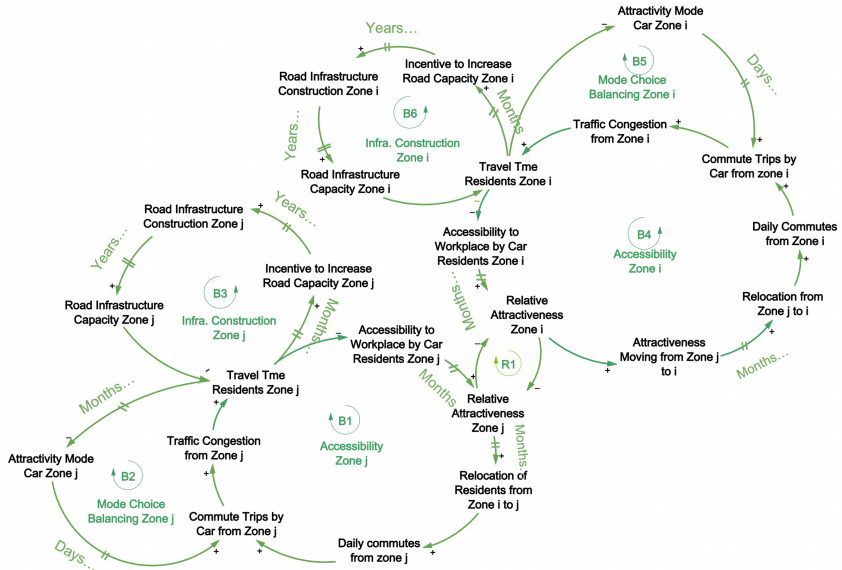
# Causal loops in transport



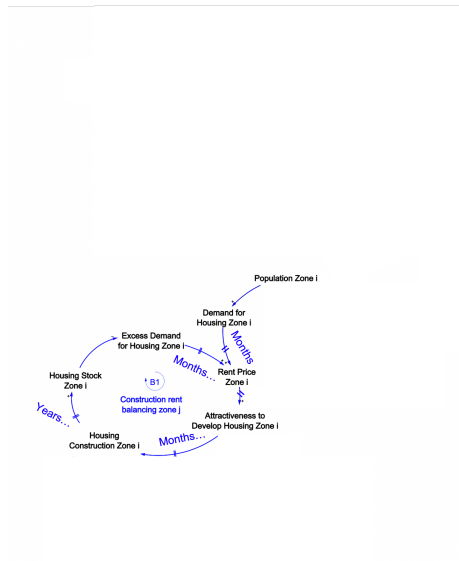
# Causal loops in transport



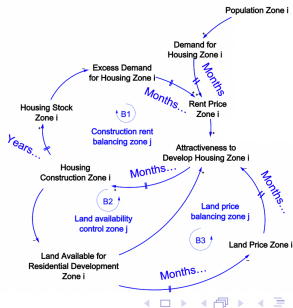
# Causal loops in transport



# Causal loops in residential location

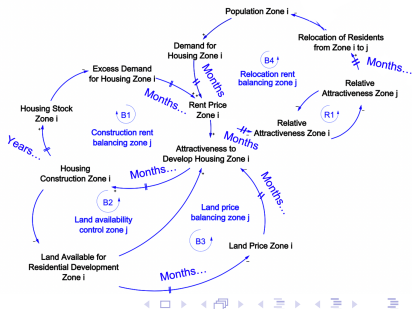


# Causal loops in residential location

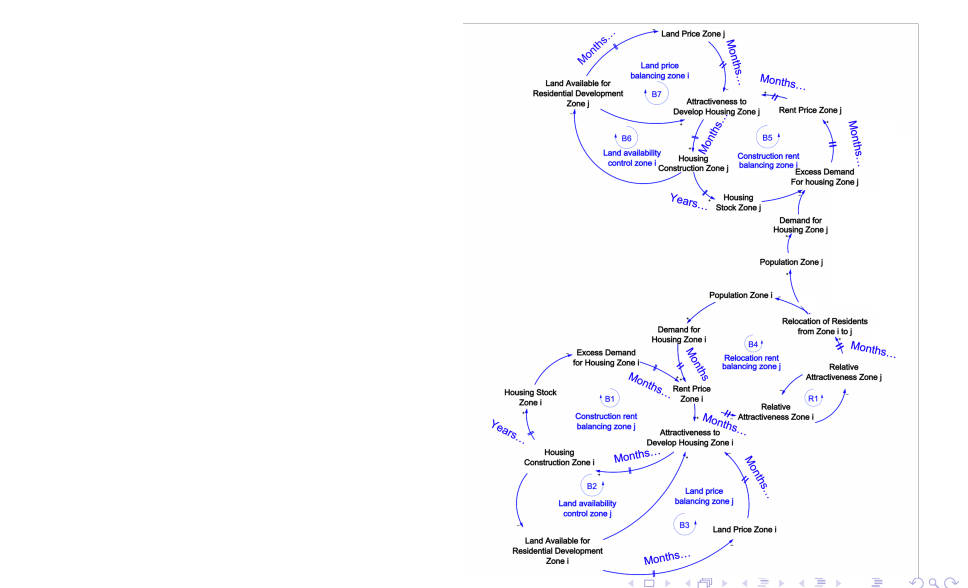




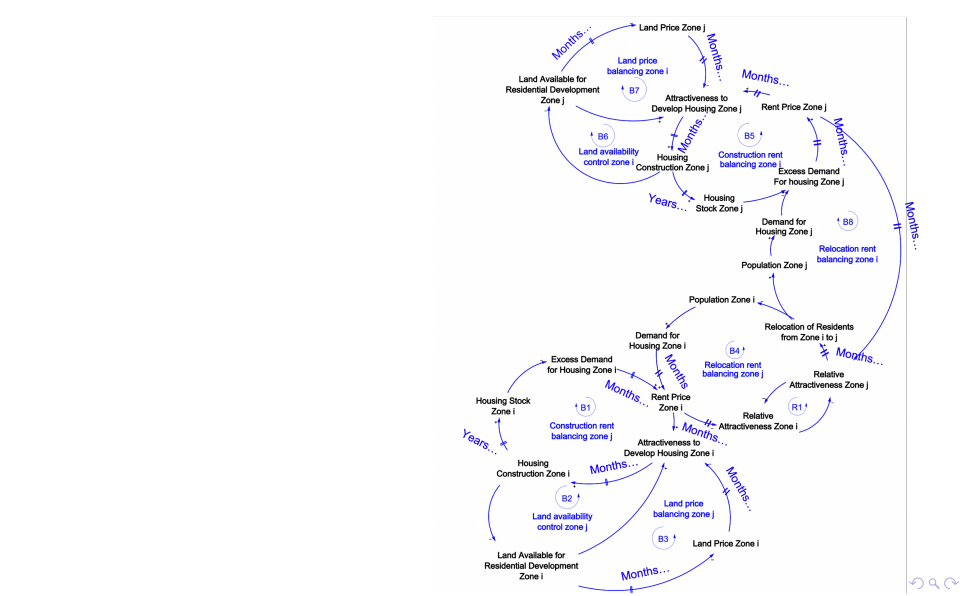
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## Causal loops in residential location



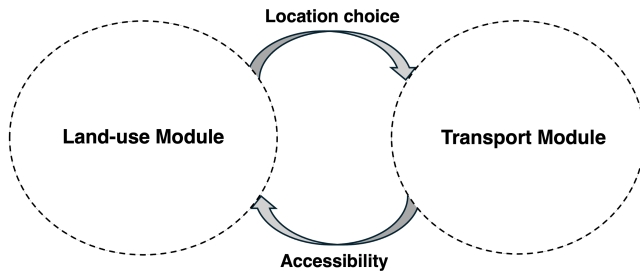
# Scope

Can we have a framework that:

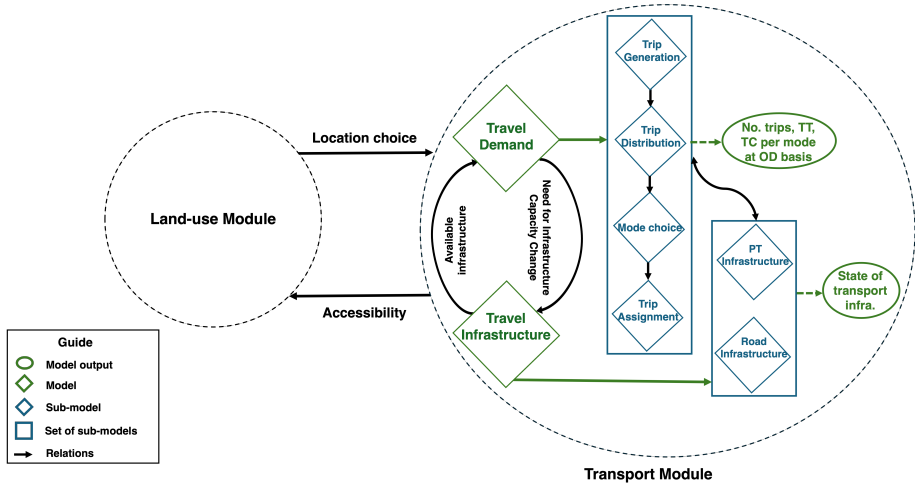
- Model both transport and land-use **endogenously** within the **same framework**.
- Capture **interaction** and feedback mechanisms **explicitly**.
- Connect **long- and short-term** choices.
- Handle **temporal leads and lags** between processes.
- **Dynamic** modelling, development **path over time**.
- Spatial granularity.
- Computationally **quick**.

**Application:** Serve to **understand system behaviour**, anticipate future trends and investigate consequences of **policy reforms**.

# Integrated approach



# Transport module



# Travel demand model: Trip generation sub-model

- In trip generation, the **number of trips originating from each zone** is estimated.

$$T_i(t) = N^{\text{Empl}}(t) \lambda_{\text{Trip}}^{\text{Peak}}$$

- $T_i(t)$ : number of morning peak-period commute trips originating from zone  $i$  at timestep  $t$ .
- $\lambda_{\text{Trip}}^{\text{Peak}}$ : commute trip rate per employed individual during the morning peak on workday.
- $N^{\text{Empl}}(t)$ : number of employed residents in zone  $i$  at time  $t$ .



# Travel demand model: Trip distribution sub-model

- Generated trips are allocated to destination zones based on a gravity model.

$$T_{ij}(t) = T_i(t) \frac{A_j(t) \text{FF}(\text{GC}_{ij}(t))}{\sum_k A_k(t) \text{FF}(\text{GC}_{ik}(t))}$$

- $T_{ij}(t)$ : number of morning peak commutes from origin zone  $i$  to  $j$ .
- $T_i(t)$ : produced commute trips from  $i$ .
- $A_j(t)$ : Attraction of destination zone  $j$  (number of jobs).
- $\text{FF}(\text{GC}_{ij}(t))$ : Deterrence function for a trip from  $i$  to  $j$ , considering perceived generalised cost.





# Travel demand model: Mode-choice sub-model

- Mode choice is modelled using a Logit specification.

$$T_{ij}^m(t) = T_{ij}(t) \frac{e^{V_{ij}^m(t)}}{\sum_{m'} e^{V_{ij}^{m'}(t)}}$$

- $T_{ij}^m(t)$ : number of morning peak commuters from zone  $i$  to  $j$  by mode  $m$ .
- $T_{ij}(t)$ : number of morning peak commute trips from zone  $i$  to  $j$ .
- $V_{ij}^m(t)$ : utility of mode  $m$  for that OD, considering perceived travel time and cost.



# Travel demand model: Trip assignment sub-model

- Trips are studied at the corridor level.
- *Assumption*: there is one corridor between each origin and destination pair.



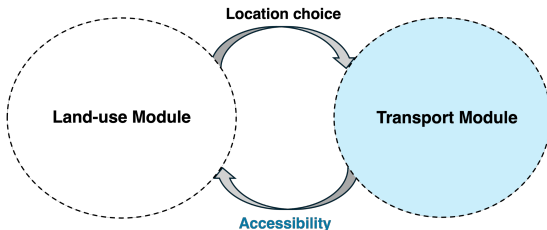
# Transport module: Transport infrastructure development model

- It uses aggregate speed-flow relationships, based on transport planning manuals (Highway Capacity Manual), for each origin-destination movement.
- The decision to increase the transport infrastructure capacity is determined with a set of rules based on the speed at morning peak and number of commutes.

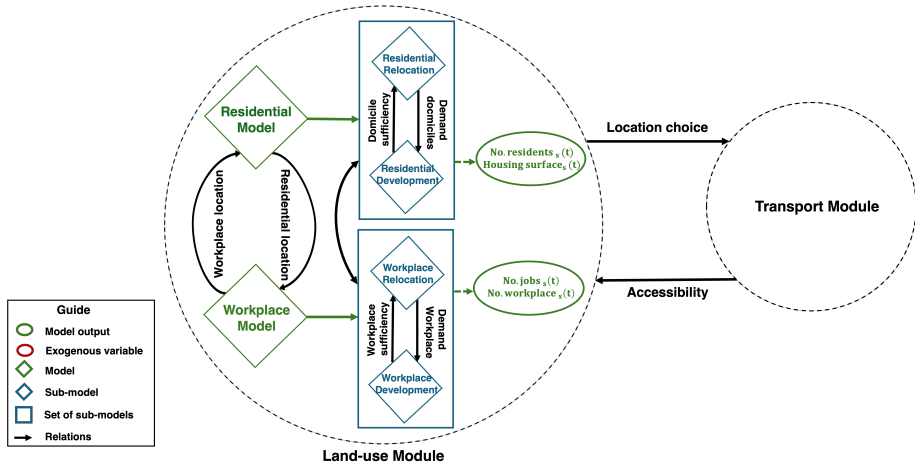


## Transport module: output

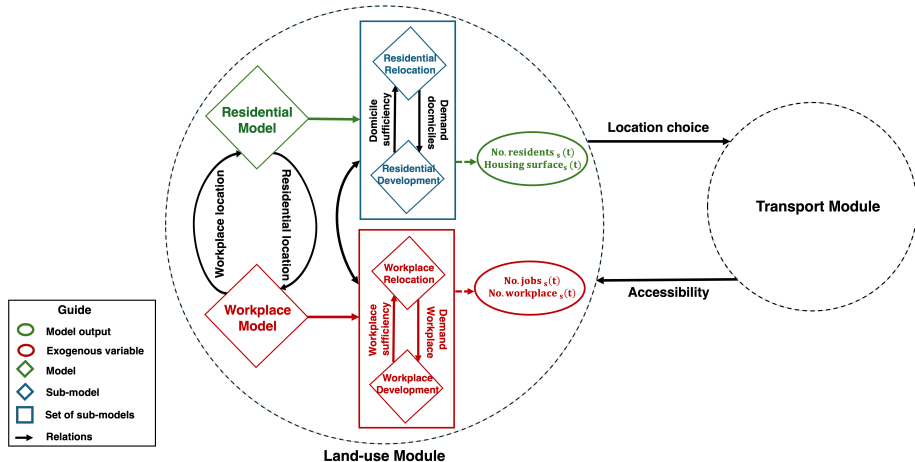
The output of the transport module at each timestep is the transport flows at an origin-destination basis by each mode, travel times and cost between each origin-destination pair, as well as transport infrastructure, which links the transport module back to the land-use module through accessibility.



# Land-use module



# Land-use module



# Residential relocation sub-model

- The residential relocation sub-model models the relocation of residents within the zones in the area through 3 steps:
  - The **out-migration of residents** is estimated for each zone.
  - The out-migration residents are **pooled** over all the zones.
  - The movers are **distributed** within residential zones based on a **logit model** considering the characteristics of the destination such as perceived rent prices and accessibility to workplace.



# Residential development sub-model

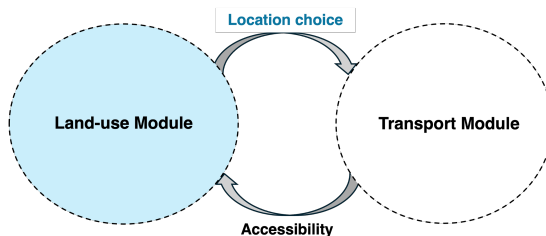
- The development decision is based on the following factors:
  - demand for housing,
  - achievable rent,
  - availability of land for construction.
- The new housings would be ready to domicile after an externally defined **time lag** of construction time.





## Land-use module: output

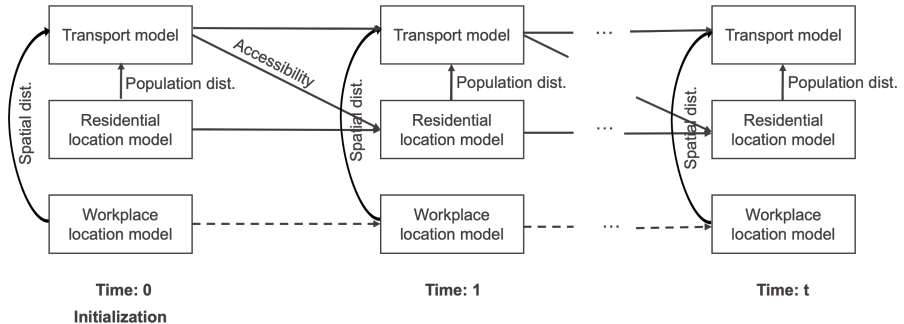
The output of the land-use module in each timestep is the spatial distribution, which links the land-use module back to the transport module.



# Specification

- Dynamic model.
- Spatial: discrete urban zonal level.
- Time-step: days.
- Development path over time.

# Stepping through time...



# Case study: Luxembourg

## Data sources:

- Census and IGSS: demographic data.
- Mobility observatory and census: travel data.
- Housing observatory: developments, prices, land use.

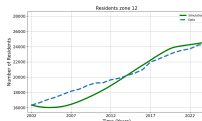
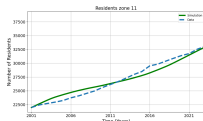
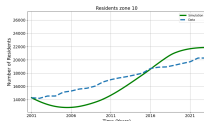
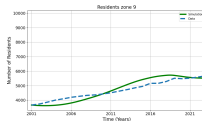
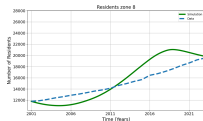
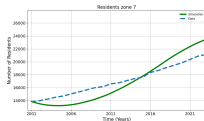
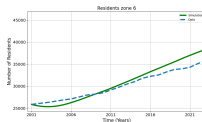
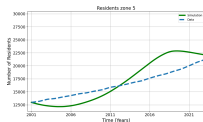
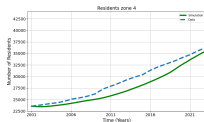
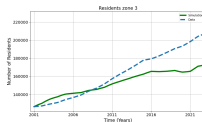
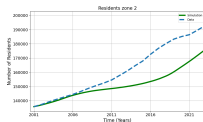
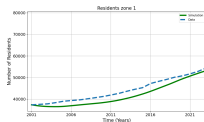
## Model setup:

- Spatial resolution: 15 zones (12 cantons + 3 cross-border).
- Daily time step.
- Parameters calibrated/estimated to match observations.
- Time period: 2001 to ... (e.g., 50 years).



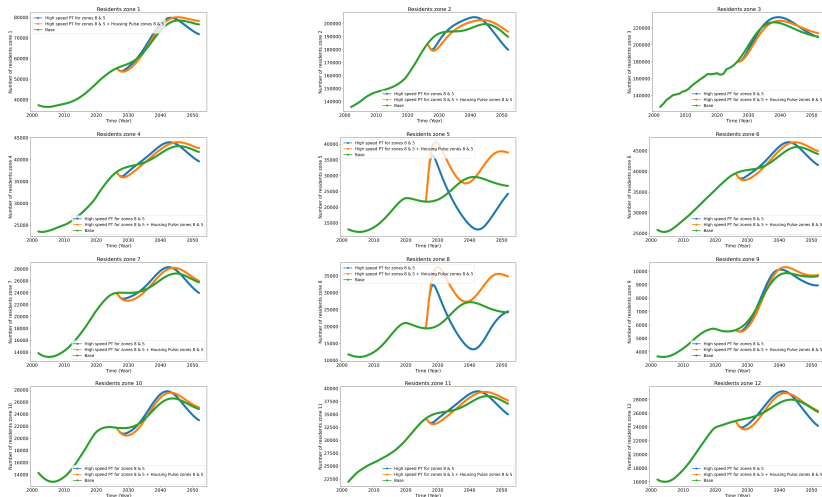
\* Source: Luxembourg Institute of Socio-Economic Research (LISER)

# Calibration



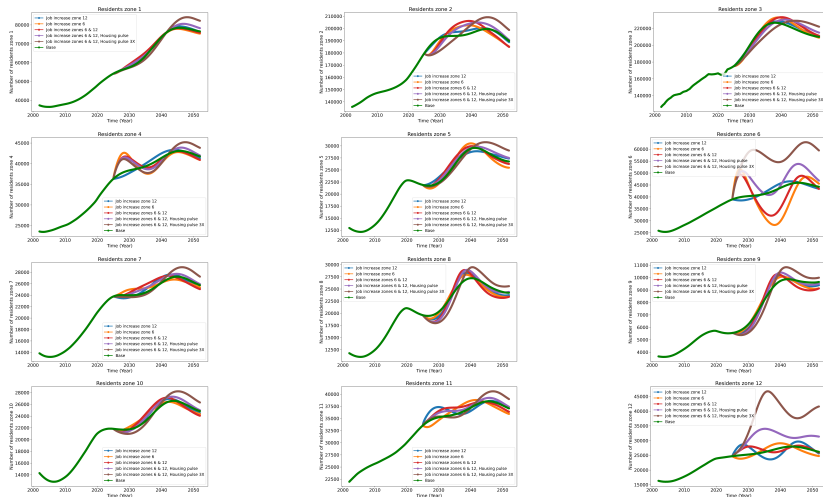
*Time series of residents in 12 internal Luxembourg cantons*

# Example scenarios – Highspeed PT in Clervaux and Wiltz










*Time series of residents in 12 internal Luxembourg cantons – Highspeed PT scenario*

# Example scenarios – Job increase in Diekirch and Remich



*Time series of residents in 12 internal cantons in Luxembourg – Job increase scenario*

# Summary

- Motivation: decision support tool, with systematic view of land use and mobility patterns, to assess the long-term impact of transport and land use policies.
- Use system dynamics mapping and modelling.
- Support data-driven planning, while remaining computationally efficient.
- Main advantages of the framework:
  -  Integrated design.
  -  Computationally efficient.
  -  Dynamic model.
  -  Reproducible
  -  Flexible.
  -  Easy to understand.
  -  Policy combinations.



# Key takeaways

- Cross-national application.
- Daily modelling timesteps.
- The approach balances sufficient detail to support evidence-based planning while remaining computationally efficient.
- Link discrete choice modelling with systems thinking and system dynamic modelling for improved calibration.

# To conclude

## Future work:

- Define and assess policies with different KPIs (welfare, equity, cost-benefit, etc).
- Economic aspects; time value of money and inflation.
- Model fits can be improved further.
- Probabilistic modelling.
- Other choice complexities; e.g., buying or renting for satisfying residential demand.

# Acknowledgment

We would like to thank the team at LISER, especially Frédéric Docquier, Philippe Gerber, and Antoine Paccoud for data acquisition.

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Thank You!

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