

# LEUVEN'S SUSTAINABLE MODAL SHIFT

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## PROJECT GOAL

# WE ARE OPTIMIZING THE LOCATIONS OF MOBILITY HUBS FOR THE BELGIAN CITY OF LEUVEN



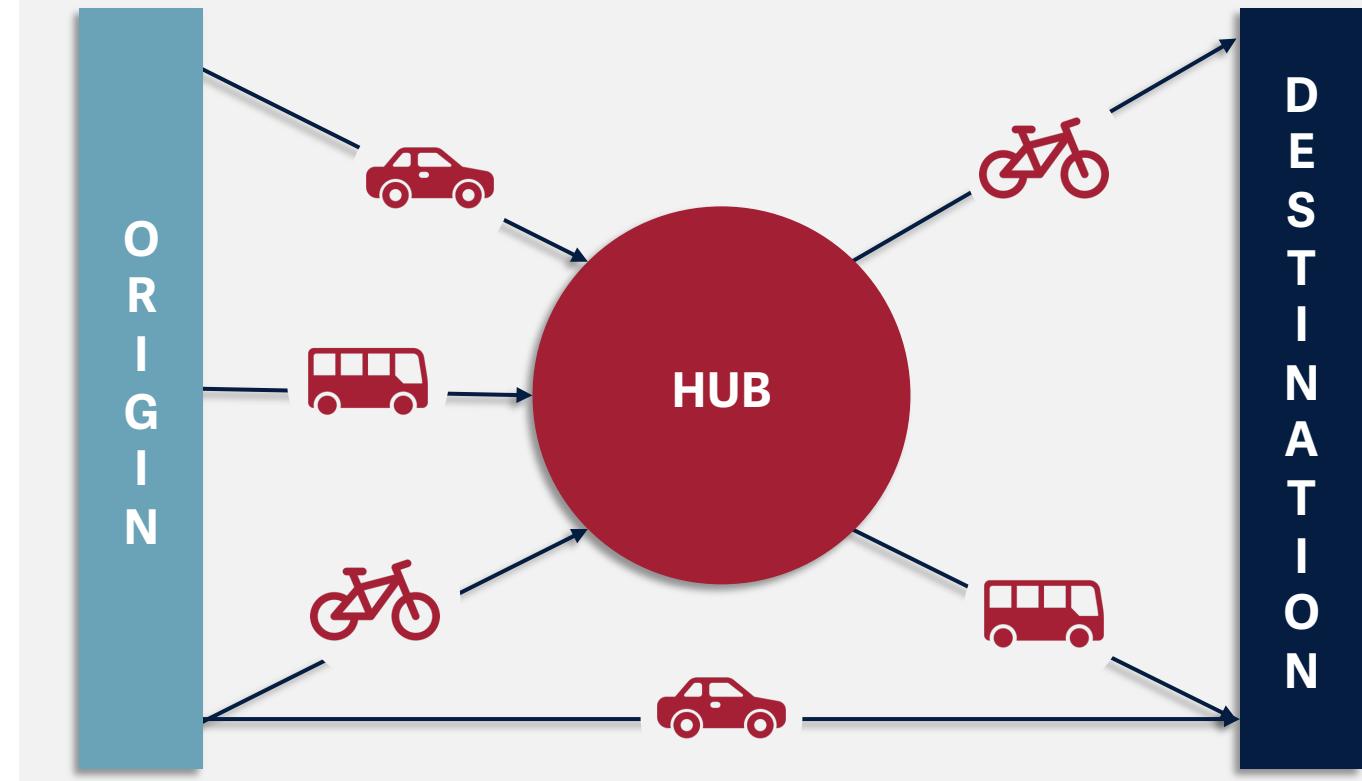
## LEUVEN'S GOALS

1. Become a **climate-neutral** municipality
2. Shift towards **sustainable transport system**
3. Strongly **reduce traffic congestions** due to private cars



Create mobility hubs throughout the city

## EXAMPLE: HUBS ENABLE MODE CHANGES

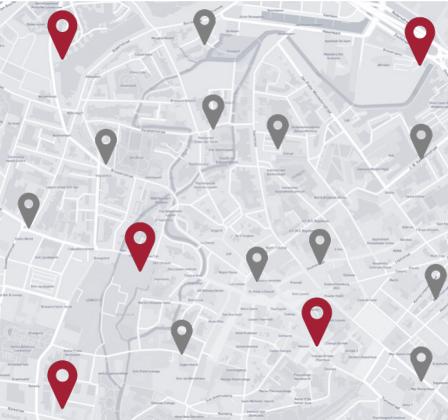


## OPTIMIZATION MODEL

# THE MULTI-OBJECTIVE MIXED-INTEGER MODEL MINIMIZES BOTH CO<sub>2</sub> EMISSIONS AND TRAVEL TIME



### Decision Variables



1. Activation of optimal hubs  
from subset of candidates

103 binary variables

2. Expected flow by mode  
depending on activated hubs

30m continuous variables

### Objective Function

Minimize

Total CO<sub>2</sub>  
emissions

+  $\gamma$  ×

Total  
travel time

$\gamma$ : willingness to accept higher  
travel times for lower emissions

### Con- straints



Maximum hub  
number



Balanced  
flow



Demand  
satisfaction



Bike/parking  
availability



## MAIN RESULT

By making a 30-minute Leuven commute **5** minutes longer,  
we can save the CO<sub>2</sub> emissions  
of **6300** car trips per day.



## CONSERVATIVE SCENARIO

By leaving Leuven travel times practically **unchanged**, we can save the CO<sub>2</sub> emissions of **1050** car trips per day.

## MANAGERIAL RECOMMENDATIONS

# INSTALLING 20 HUBS WILL SAVE THE CO<sub>2</sub> EMISSIONS OF AROUND 600 CARS PER DAY

## RECOMMENDATIONS

---

1

### Install 20 hubs at the locations proposed by the model

- Reduced emissions of 7,500 kg CO<sub>2</sub> per day
- 20 hubs yield the best CO<sub>2</sub>/time trade-off for a medium-high budget

2

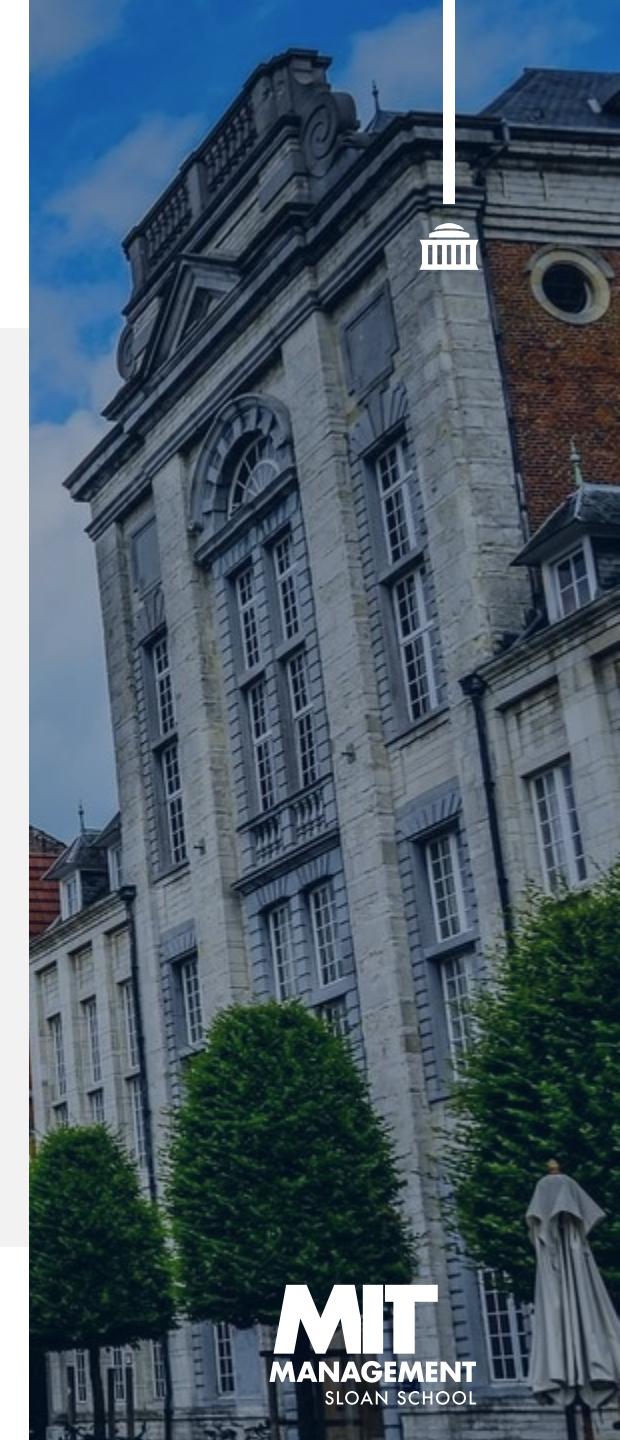
### Expand bike sharing and car parking at hub locations:

- Every hub requires a bike sharing station (e.g., Bluebike)
- Expand parking opportunities at hubs to enable “park and ride”

3

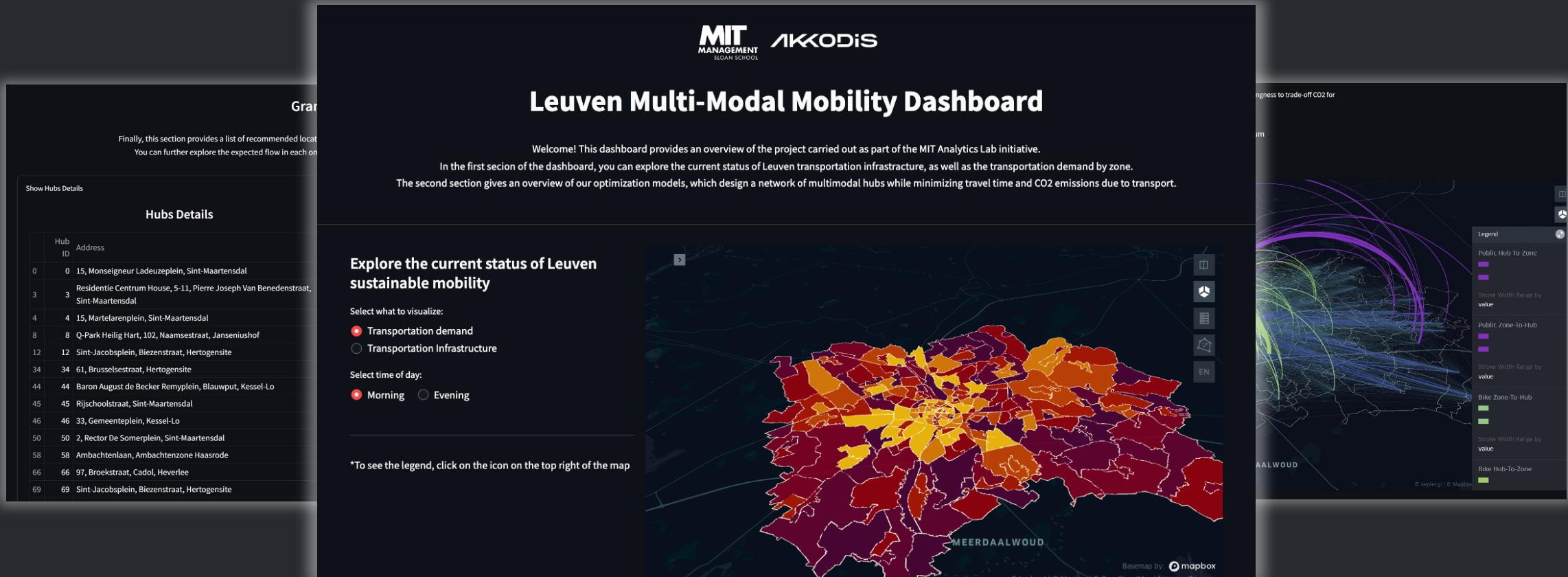
### Incentivize hub usage

- Examples: reduced cost of travel when using hub, ad campaign
- CO<sub>2</sub> reduction depends on system acceptance by citizens



# DASHBOARD

# PLAY WITH PARAMETER COMBINATIONS AND ANALYZE RESULTS IN THE DASHBOARD



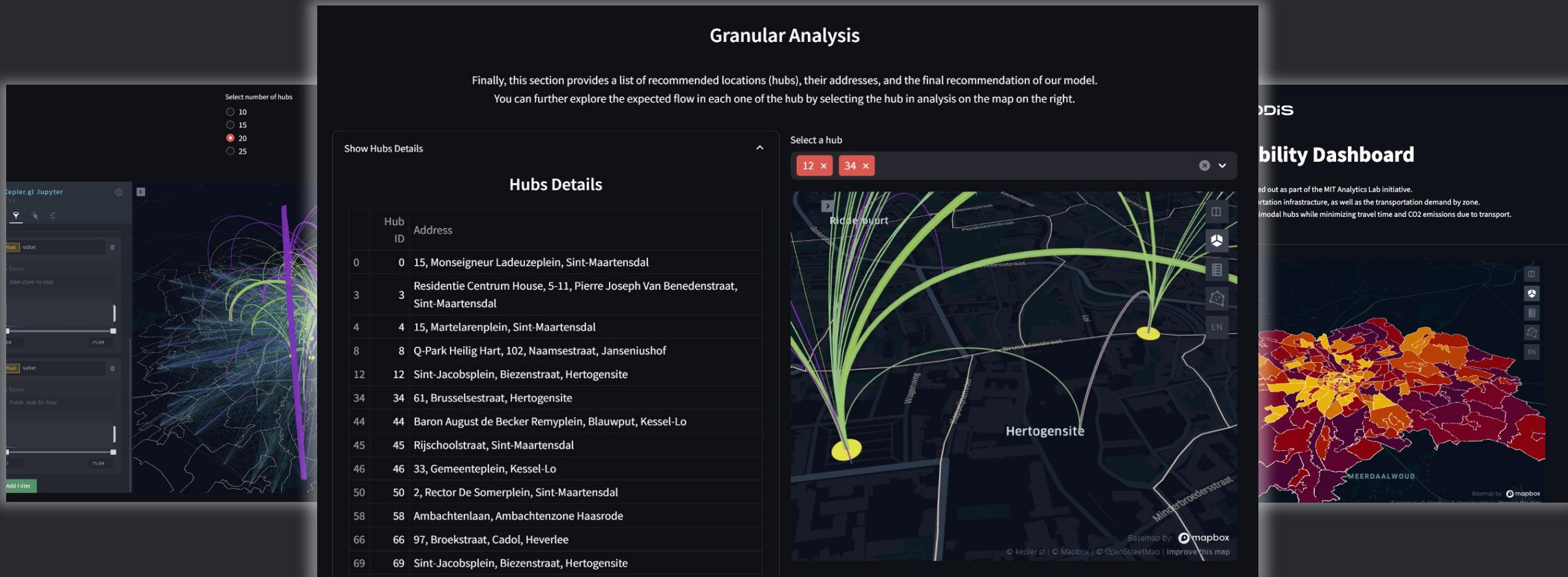
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# DASHBOARD

## PLAY WITH PARAMETER COMBINATIONS AND ANALYZE RESULTS IN THE DASHBOARD



# THANK YOU!

Leuven's Sustainable Modal Shift

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# THE MATHEMATICAL FORMULATION MODELS THE DIFFERENT SCENARIOS PRECISELY



## FORMULATION

$$\min_{a_k} E_{Total} + \gamma T_{Total}$$

where  $E_{Total} = \sum_{i=1}^Z \sum_{j=1}^Z CD_{ij} E_{ij(Car)} + \sum_{i=1}^Z \sum_{k=1}^K \sum_{j=1}^Z CH_{ikj} E_{ik(Car)} + \sum_{i=1}^Z \sum_{k=1}^K \sum_{j=1}^Z PH_{ikj} E_{ik(Public)}$

$$+ \sum_{i=1}^Z \sum_{k=1}^K \sum_{j=1}^Z PZ_{ikj} E_{kj(Public)}$$

$$T_{Total} = \sum_{i=1}^Z \sum_{j=1}^Z CD_{ij} T_{ij(Car)} + \sum_{i=1}^Z \sum_{k=1}^K \sum_{j=1}^Z CH_{ikj} T_{ik(Car)} + \sum_{i=1}^Z \sum_{k=1}^K \sum_{j=1}^Z BH_{ikj} T_{ik(Bike)}$$

$$+ \sum_{i=1}^Z \sum_{k=1}^K \sum_{j=1}^Z BZ_{ikj} T_{kj(Bike)} + \sum_{i=1}^Z \sum_{k=1}^K \sum_{j=1}^Z PH_{ikj} T_{ik(Public)} + \sum_{i=1}^Z \sum_{k=1}^K \sum_{j=1}^Z PZ_{ikj} T_{kj(Public)}$$

s.t.  $CH_{ikj} + BH_{ikj} + PH_{ikj} = BZ_{ikj} + PZ_{ikj}$

$\forall i, j \in [Z], \forall k \in [K]$

$$CD_{ij} + \sum_{k=1}^K (CH_{ikj} + BH_{ikj} + PH_{ikj}) = d_{ij}$$

$\forall i, j \in [Z]$

$$BH_{ikj} \leq M * CN_{ik(BH)} * \alpha_k$$

$\forall i, j \in [Z], \forall k \in [K]$

$$PH_{ikj} \leq M * CN_{ik(PH)} * \alpha_k$$

$\forall i, j \in [Z], \forall k \in [K]$

$$PZ_{ikj} \leq M * CN_{ij(PZ)} * \alpha_k$$

$\forall i, j \in [Z], \forall k \in [K]$

$$BZ_{ikj} \leq M * CN_{ij(BZ)} * \alpha_k$$

$\forall i, j \in [Z], \forall k \in [K]$

$$CH_{ikj} \leq M * \alpha_k$$

$\forall i, j \in [Z], \forall k \in [K]$

$$\sum_{i=1}^Z \sum_{j=1}^Z BZ_{ikj} \leq B_k$$

$\forall k \in [K]$

$$\sum_{i=1}^Z \sum_{j=1}^Z PZ_{ikj} \leq P_k$$

$\forall k \in [K]$

$$\sum_{k=1}^K \alpha_k \leq MH$$

$\forall k \in [K]$

$$\alpha_k \in \{0, 1\}$$

$$CD_{ij}, CH_{ikj}, PH_{ikj}, BH_{ikj}, PZ_{ikj}, BZ_{ikj}, E_{Total}, T_{Total} \geq 0$$

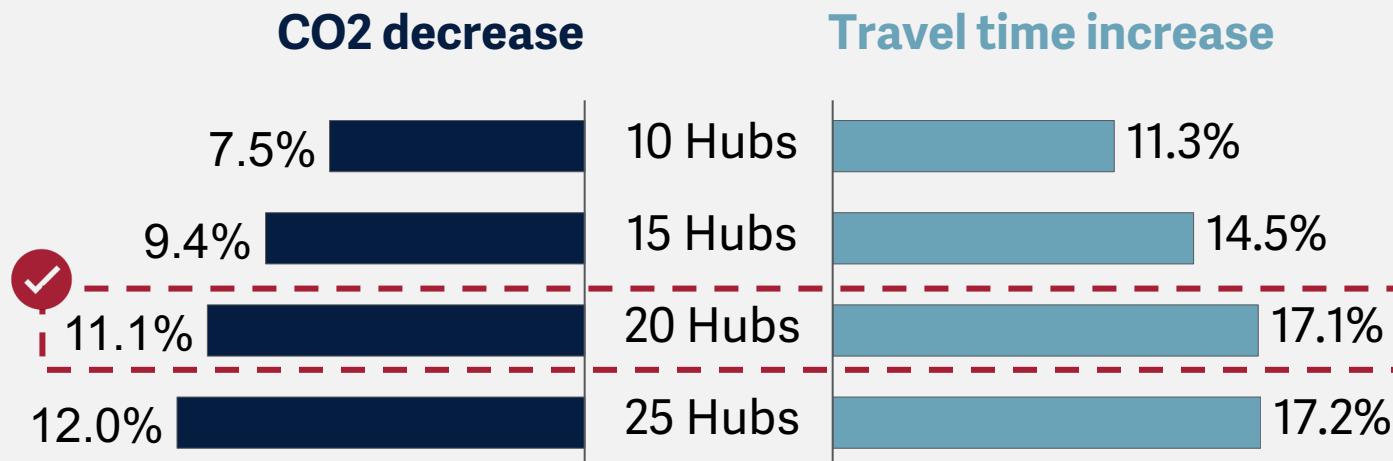
$\forall i, j \in [Z], \forall k \in [K]$

## RESULTS AND RECOMMENDATIONS

# INSTALLING 20 HUBS WILL YIELD A CO2 REDUCTION OF >11% FOR LEUVEN AND ITS CITIZENS



## RESULTS BASED ON NUMBER OF HUBS



*Assuming realistically high acceptance of higher travel times for lower CO<sub>2</sub> emissions ( $\gamma = 0.86$ ).*

## RECOMMENDATIONS

- 1 **Install 20 hubs:** this combination of hubs yields the best CO<sub>2</sub>/time trade-off
- 2 **Expand bike sharing and car parking:** every hub requires a bike station
- 3 **Incentivize hub usage:** CO<sub>2</sub> reduction depends on system acceptance by citizens

# THE RESULTS OF THE MODEL ARE MOST INFLUENCED BY THE TRADE-OFF AND MAXIMUM HUBS PARAMETERS

