

# Urban Strategy: Digital Twins for liveable and resilient cities

Applications in Ambient Air Quality

Leonard Oirbans | CONCAWE 2024



# Digital Twins for liveable and resilient cities



- **About TNO**
- **Urban Challenges**
- **Urban Strategy**
- **Air quality simulation in Urban Strategy**
- **Examples of use cases**

Integral urban planning city of Amsterdam  
Real time air quality in the Amsterdam region  
NO<sub>2</sub> emission reduction strategies in Germany  
Zero emission strategy for busses in Singapore

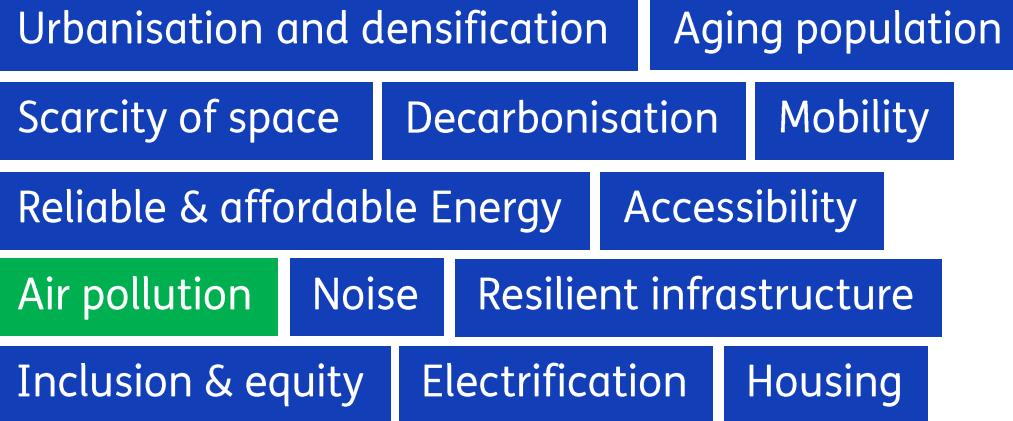
# About TNO

## TNO: Innovation for life

- Netherlands largest, independent Research & Technology Organisation (RTO)
- 4.000+ employees
- Founded by law in 1932
- TNO's mission is to create impactful innovations for the sustainable wellbeing and prosperity of society.



# Urban Challenges



## Cities are increasingly complex systems

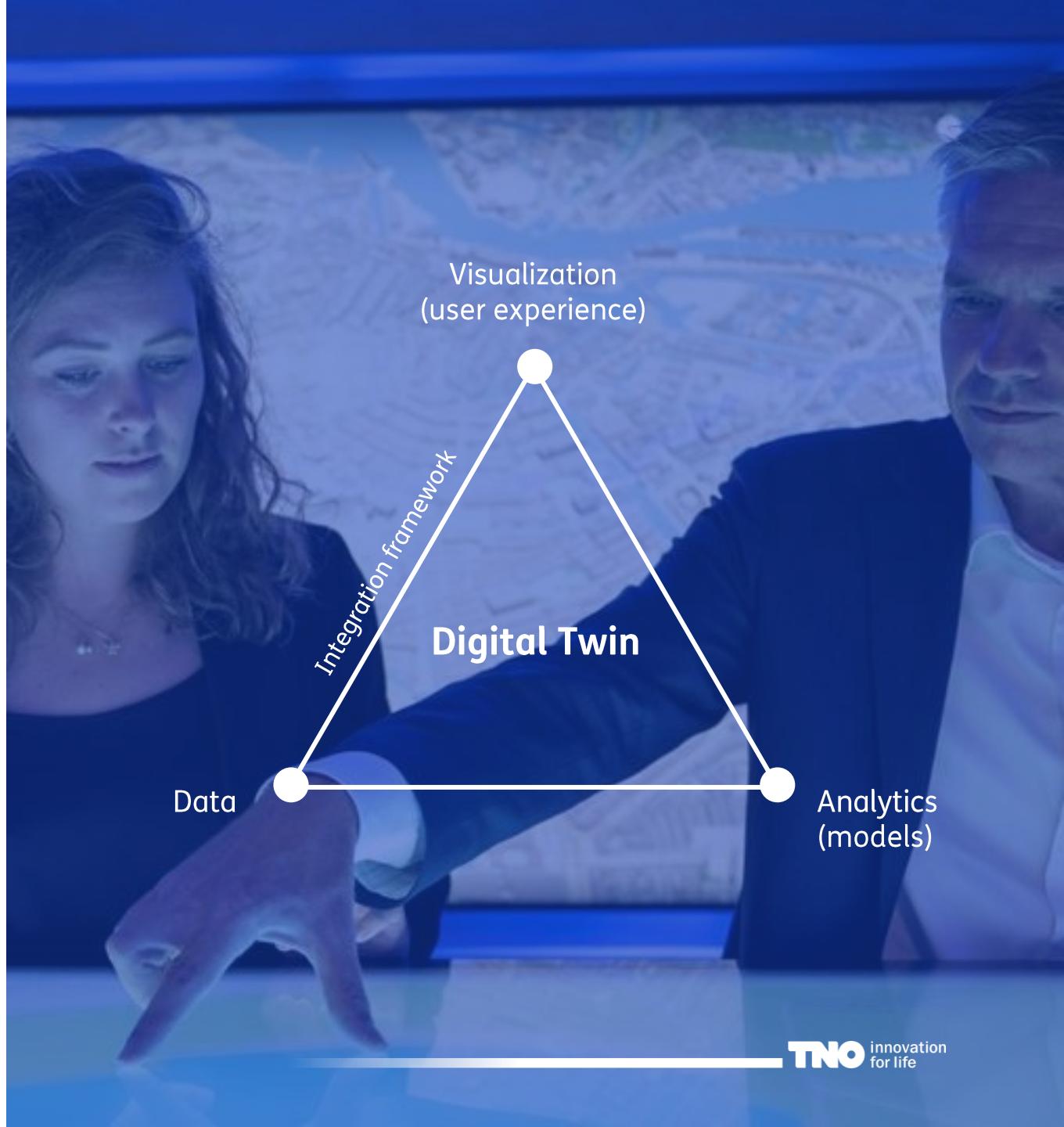
- Simultaneous transitions in multiple domains, which are increasingly intertwined.
- Requiring a balanced and integral approach to form future proof policies.



# Urban Strategy

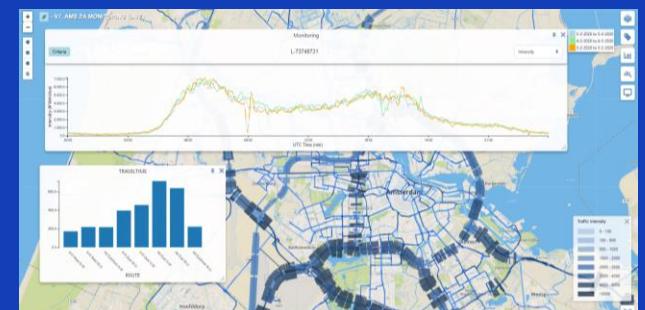
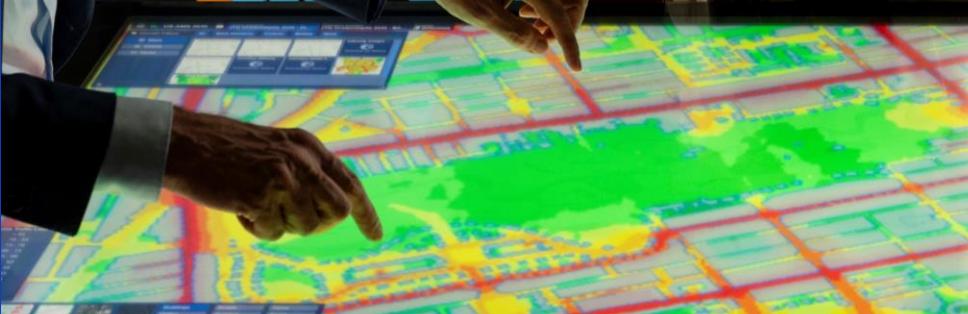
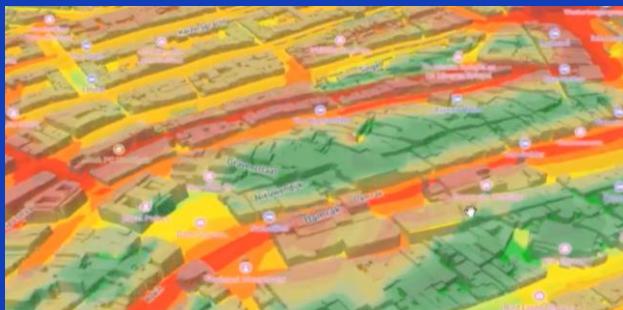
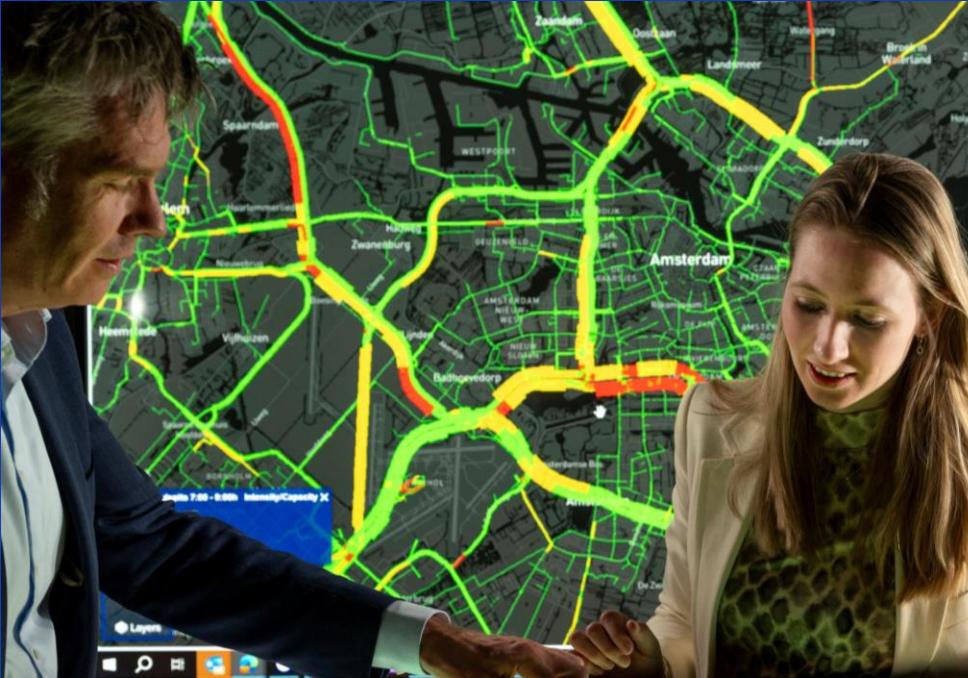
## Making complexity manageable

- Unique multi-modal Digital Twin approach for interactive and integral urban planning.
- Integrating data, visualization and analytics to construct realistic digital replicas of the real world.
- Utilizing high performance computing, resulting in very large scaling potential.
- Interactively explore the solution space to accelerate resolving societal challenges.



Walter Lohman, Hans Cornelissen, Jeroen Borst, Ralph Klerkx, Yashar Araghi, Erwin Walraven, Building digital twins of cities using the Inter Model Broker framework, Future Generation Computer Systems, Volume 148, 2023, Pages 501-513, ISSN 0167-739X, <https://doi.org/10.1016/j.future.2023.06.024>.

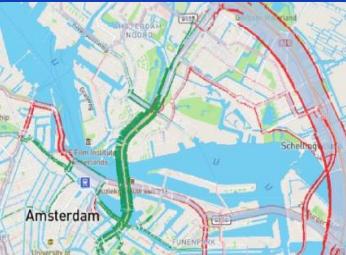
# Urban Strategy



# Urban Strategy simulation modules



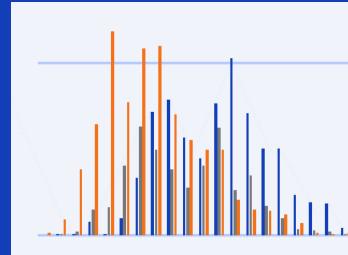
Mobility  
Demand



Multi-mode  
network allocation



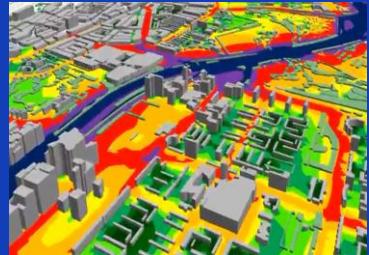
Active transport  
Cycling & Walking



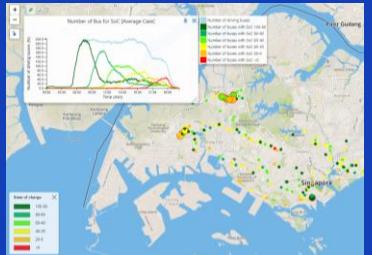
Distribution  
of accessibility



Air quality  
Road & Industry



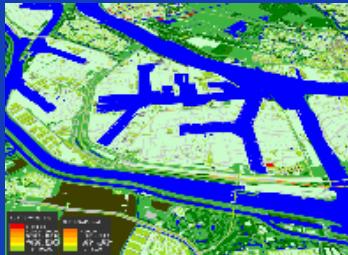
Noise  
Road, Rail, Industry



Electric fleet  
simulation



EV – power grid  
Interaction



Greenhouse gas  
emissions



Infrastructure  
Resilience



Spatial  
impacts

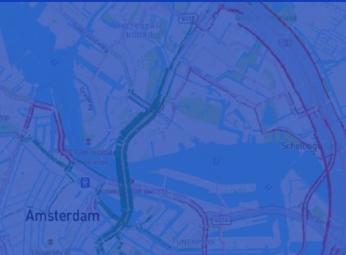


Equity indicators

# Urban Strategy simulation modules



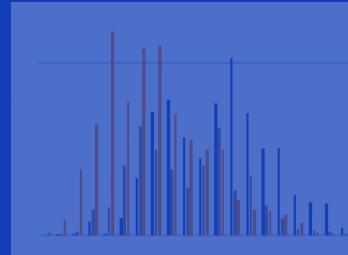
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Greenhouse gas  
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Infrastructure  
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Spatial  
impacts



Equity indicators

# Air Pollutant Emissions

## Emissions from traffic

- Carbon dioxide ( $\text{CO}_2$ )  
→ Greenhouse gas → Global Warming
- Nitrogen oxides ( $\text{NO}_x$ )  
→ Nitrogen deposition (Natura 2000)
- Nitrogen dioxide ( $\text{NO}_2$ )  
→  $\text{NO}_x \rightarrow \text{NO}_2 \rightarrow$  Health impact
- Particulate matter ( $\text{PM}_{10}$  and  $\text{PM}_{2.5}$ )  
→ Health impact



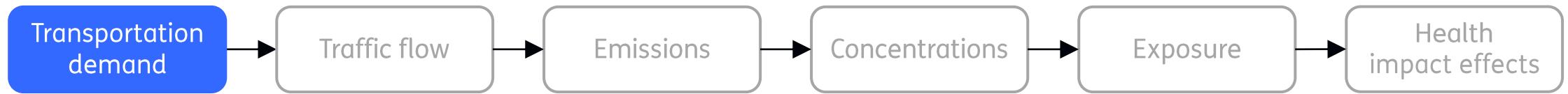
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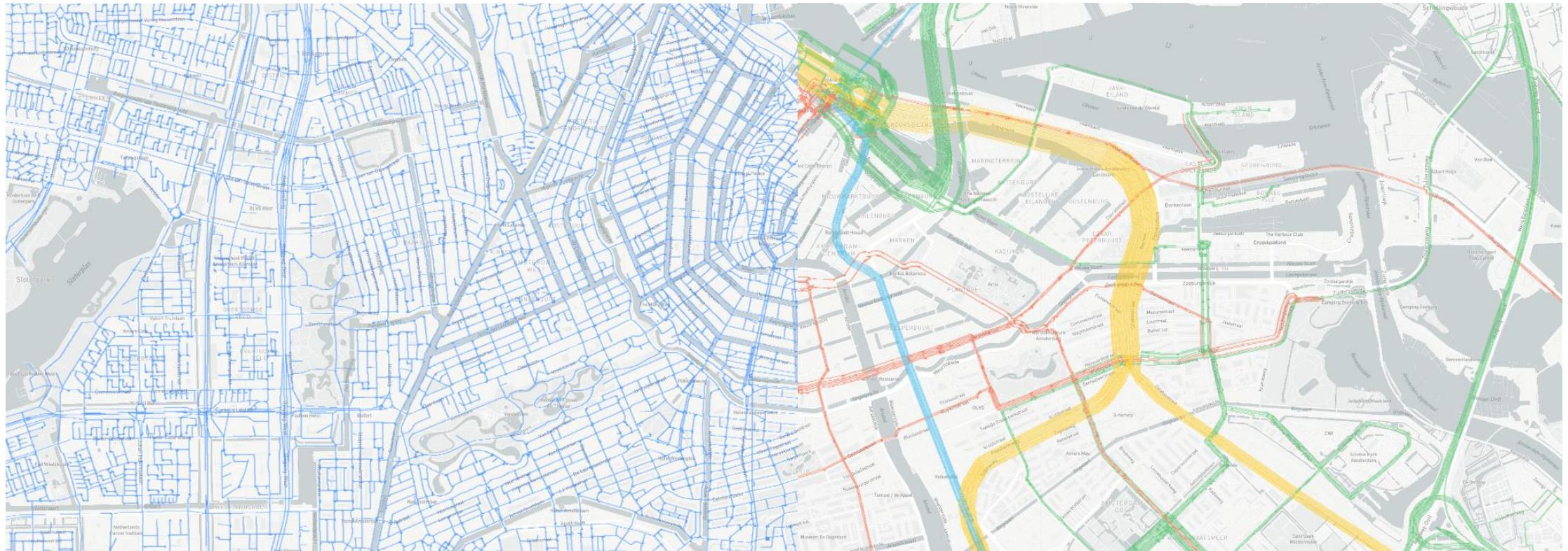
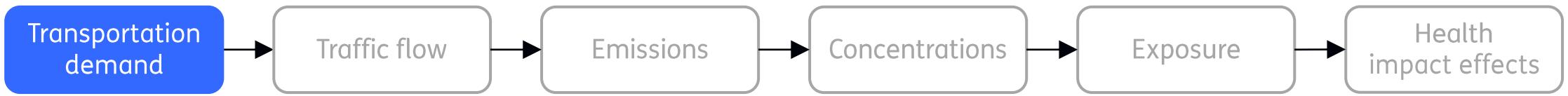
# Air Quality



**Spatial plan**

Location of houses, jobs, amenities, ...

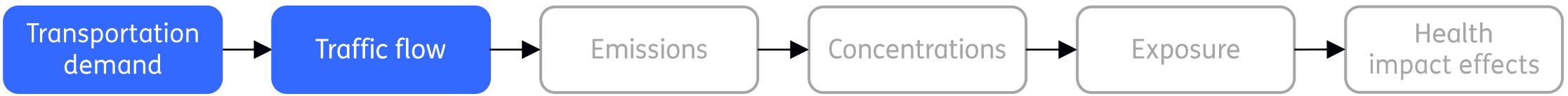
# Air Quality



**Transportation network**

Speed and capacity on roads, cycle paths, public transport options, ...

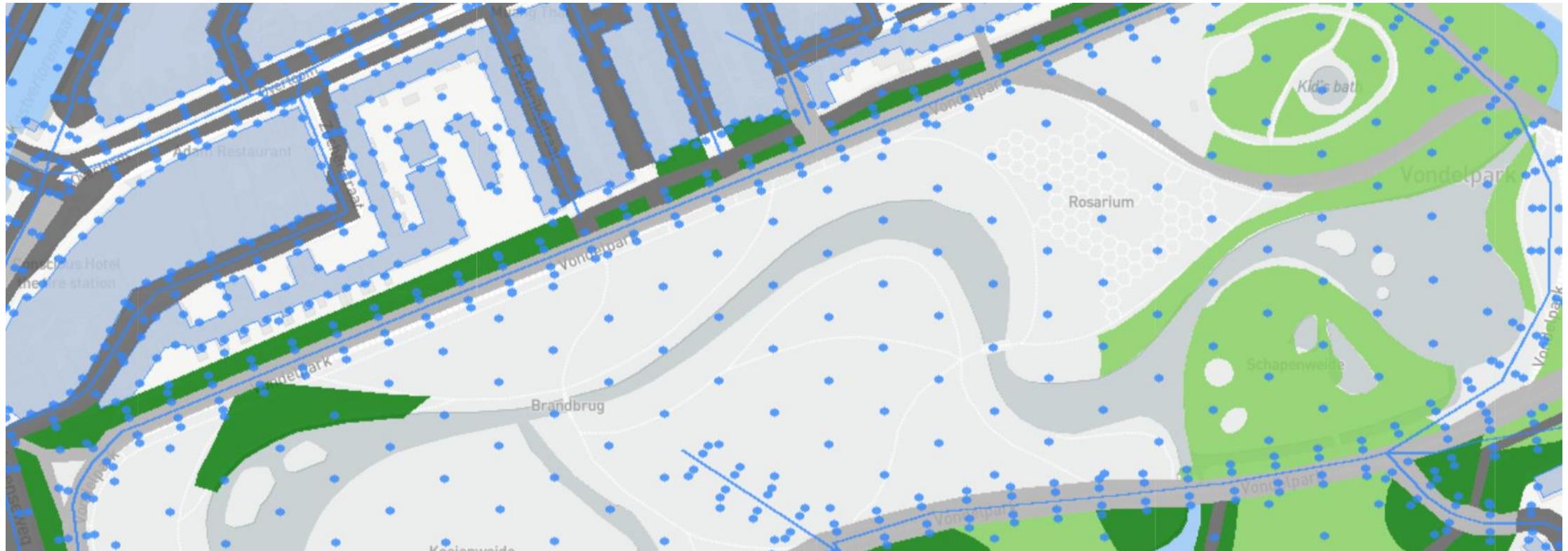
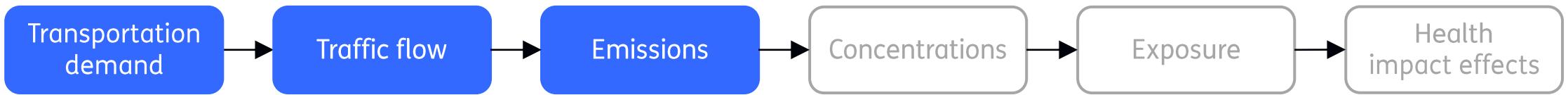
# Air Quality



## Traffic characteristics

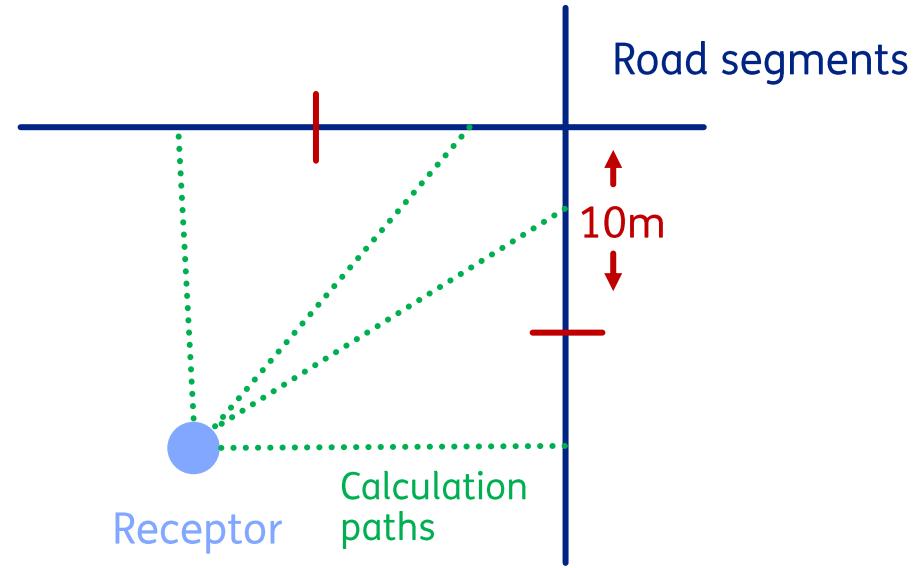
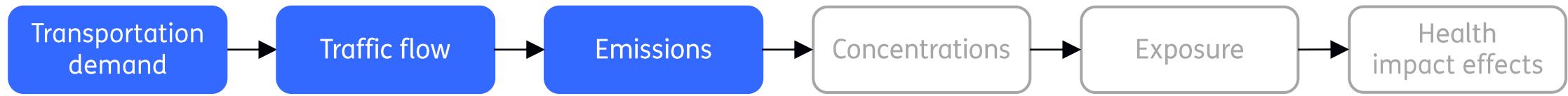
Fleet composition, street type, congestion levels, ...

# Air Quality

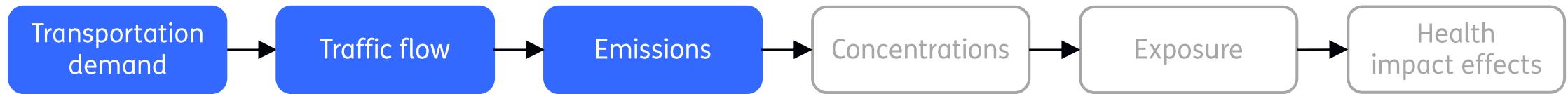


Calculation points: 'receptors'

# Air Quality

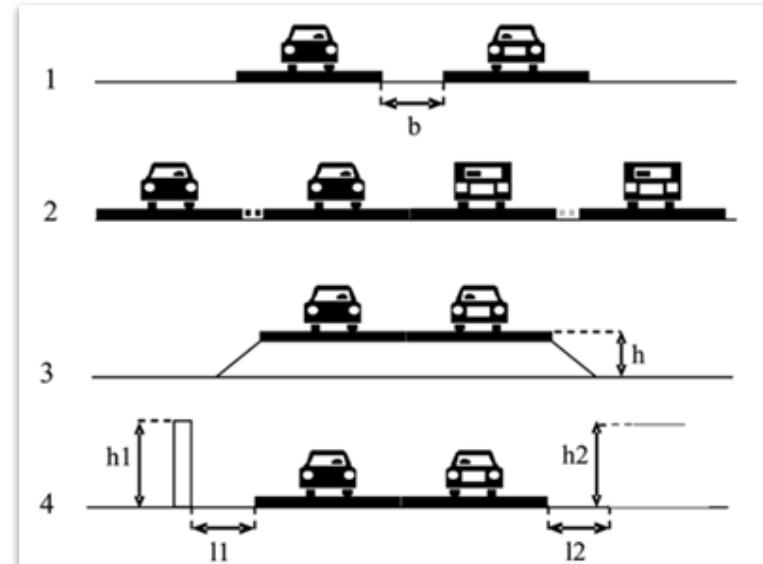
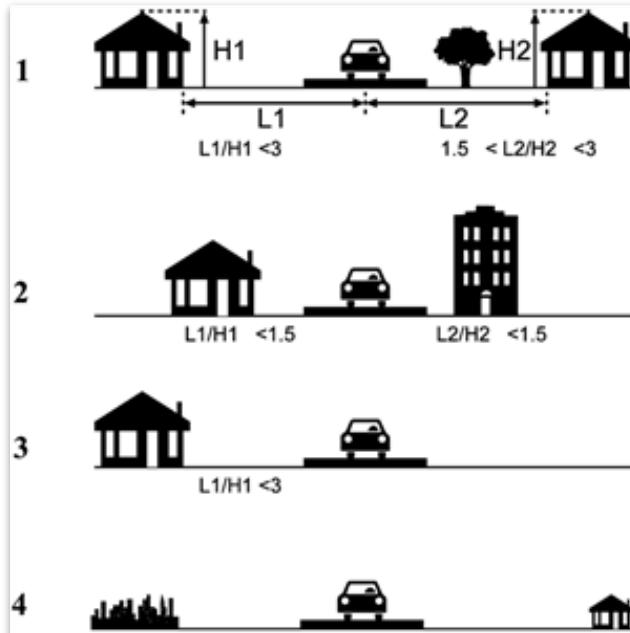


# Air Quality

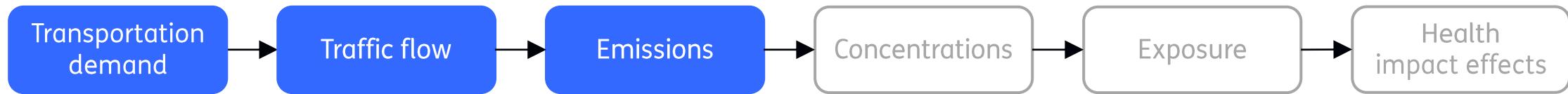


## Standard calculation method

- SRM1 'CAR' for urban roads (speed < 70 km/h)
- SRM2 'Gaussian plume' for rural roads and highways (speed  $\geq 70\text{km/h}$ )



# Air Quality: SRM1 'CAR'



$$C = C_{road} + C_{background}$$

$$C_{road} = E \cdot \Theta \cdot F_{tree} \cdot F_{region}$$

$$\Theta = a \cdot S^2 + b \cdot S + c$$

$$E = N \cdot \left( (1 - (f_M + f_Z)) \cdot E_L + f_M \cdot E_M + f_H \cdot E_H \right) \cdot \frac{1000}{24 \cdot 3600}$$

E: emission [ $\mu\text{g}/\text{ms}^{-1}$ ]

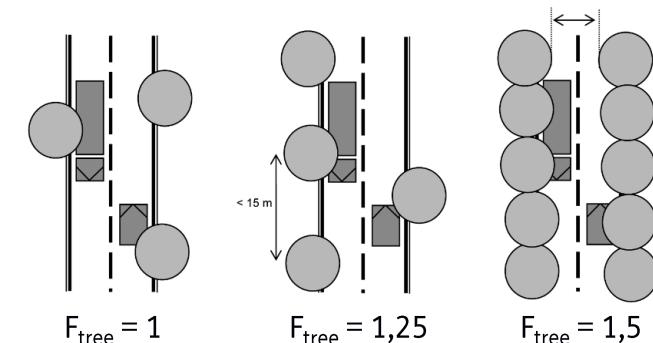
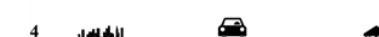
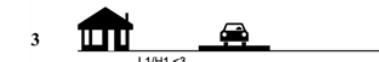
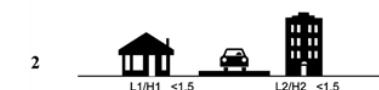
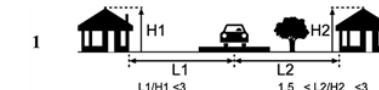
N: number of vehicles [24hour $^{-1}$ ]

$f_M$ : fraction mid duty vehicles

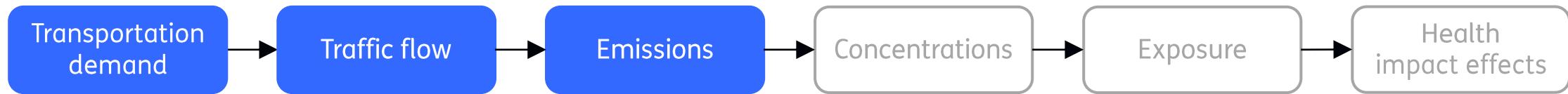
$f_H$ : fraction heavy duty vehicles

$E_L, E_M, E_H$  : emission for light, mid and heavy vehicles [g/km]

Parameter	wegtype			
	4	1	2	3
a	$3,1 \cdot 10^{-4}$	$3,25 \cdot 10^{-4}$	$4,88 \cdot 10^{-4}$	$5,00 \cdot 10^{-4}$
b	$-1,82 \cdot 10^{-2}$	$-2,05 \cdot 10^{-2}$	$-3,08 \cdot 10^{-2}$	$-3,16 \cdot 10^{-2}$
c	0,33	0,39	0,59	0,57



# Air Quality: SRM1 'CAR'



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$$C_{road} = E \cdot \Theta \cdot F_{tree} \cdot F_{region}$$

$$\Theta = a \cdot S^2 + b \cdot S + c$$

$$E = N \cdot \left( (1 - (f_M + f_Z)) \cdot E_L + f_M \cdot E_M + f_H \cdot E_H \right) \cdot \frac{1000}{24 \cdot 3600}$$

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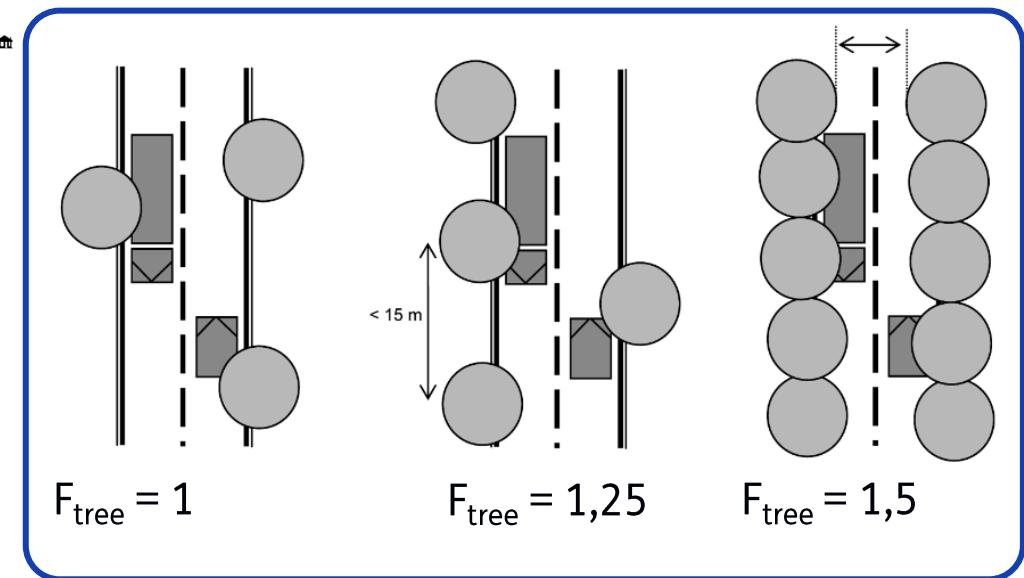
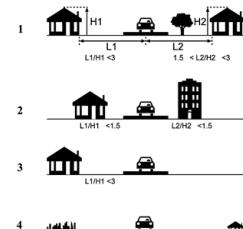
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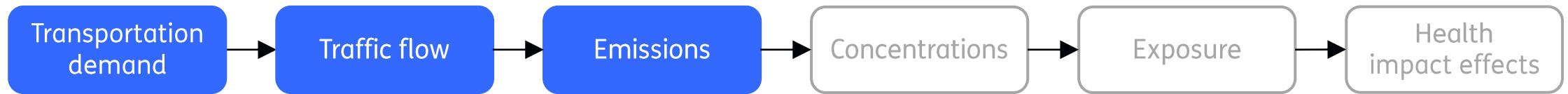
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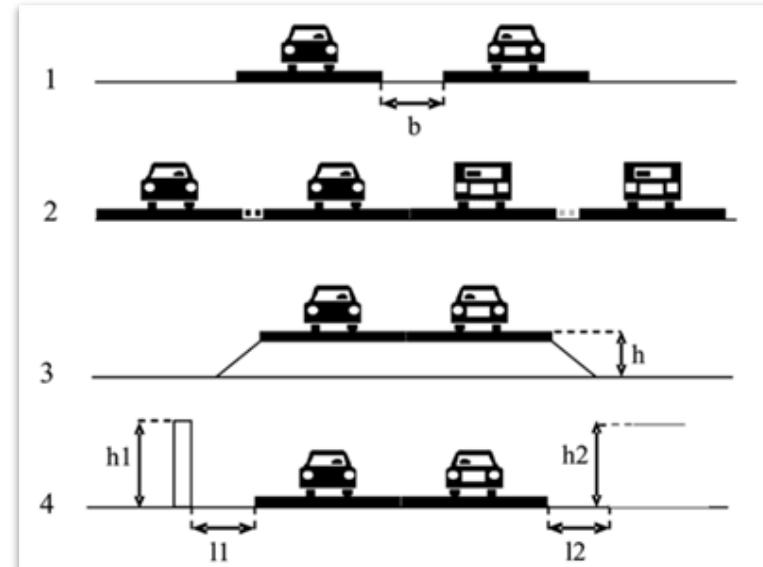
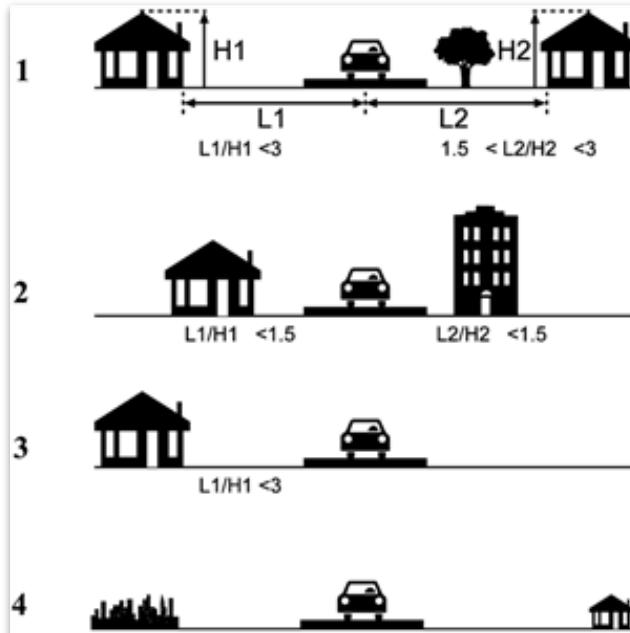


# Air Quality

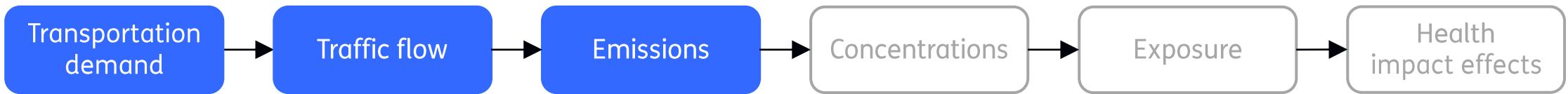


## Standard calculation method

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- SRM2 'Gaussian plume' for rural roads and highways (speed  $\geq 70\text{km/h}$ )



# Air Quality: SRM2 ‘Gaussian plume’



$$C = C_{road} + C_{background}$$

$$C_{road} = \sum_n^{12} \frac{E f_n d_r}{\sqrt{2\pi} \sigma_z} \text{ un } \pi 12 S_r \exp\left[\frac{-z^2}{2\sigma_z^2}\right]$$

E : emission [ $\mu\text{g}/\text{ms}^{-1}$ ]

dr : length of road segment [m]

$\sigma_z$  : vertical dispersion coefficient

z : height of the calculation point [m]

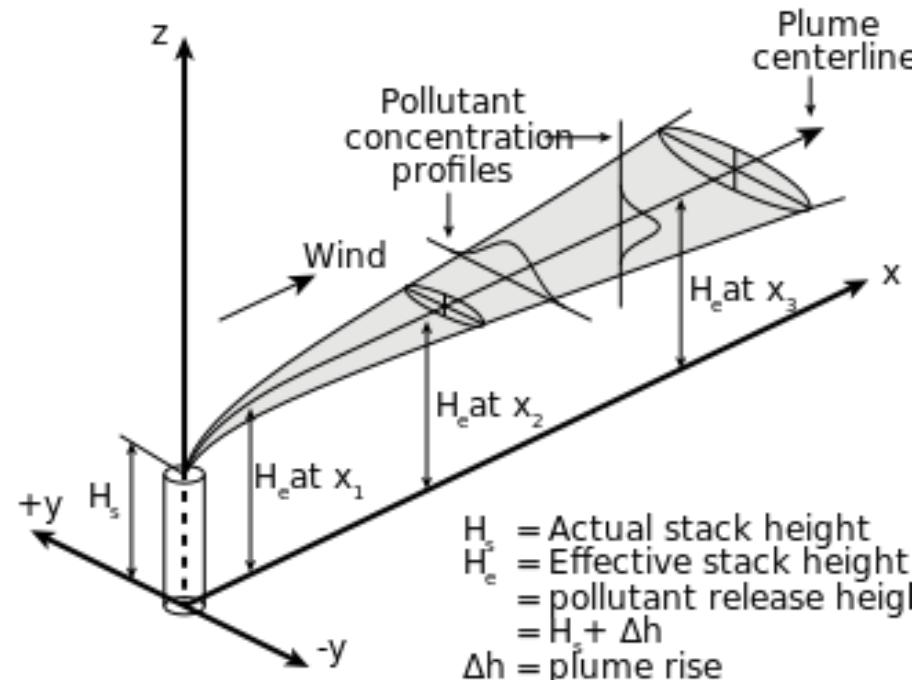
Sr : distance to road [m]

C : correction for surface roughness

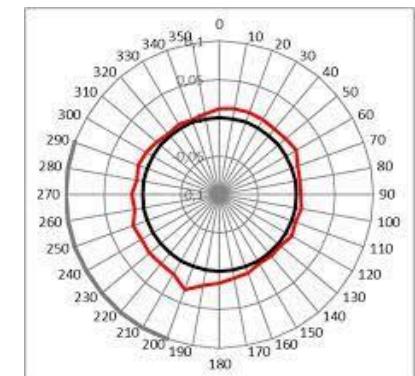
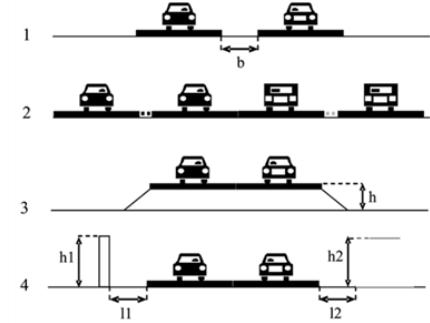
un : windspeed in direction n [m/s]

$f_n$  : time fraction of wind direction

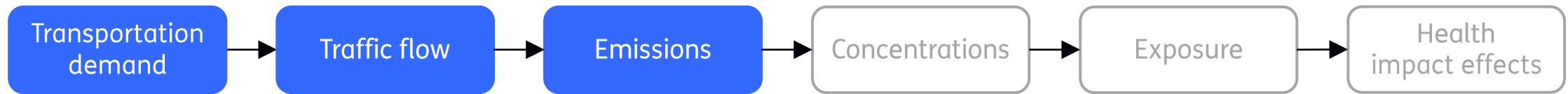
n=1 – 12 : number of wind directions



$H_s$  = Actual stack height  
 $H_e$  = Effective stack height  
 $=$  pollutant release height  
 $= H_s + \Delta h$   
 $\Delta h$  = plume rise



# Air Quality



**SRM1 'CAR'** speed < 70 km/h

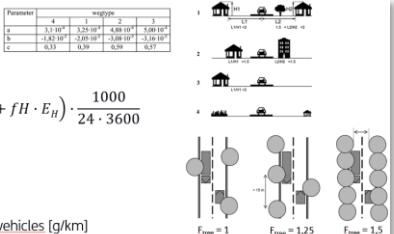
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$$\Theta = a \cdot S^2 + b \cdot S + c$$

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f<sub>M</sub>: fraction mid duty vehicles  
f<sub>H</sub>: fraction heavy duty vehicles  
E<sub>L</sub>, E<sub>M</sub>, E<sub>H</sub>: emission for light, mid and heavy vehicles [g/km]



Road segments

Receptor

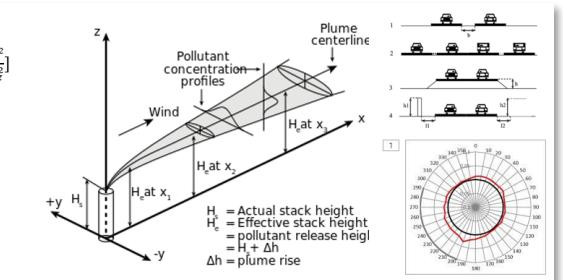
Calculation paths

**SRM2 'Gaussian plume'**  
speed  $\geq 70\text{km/h}$

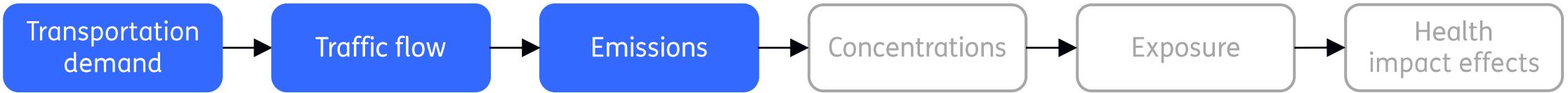
$$C = C_{road} + C_{background}$$

$$C_{road} = \sum_{n=1}^{12} \frac{E f_n d_r}{\sqrt{2\pi} \sigma_z C \ln \pi / 12 S_r} \exp\left[-\frac{z^2}{2\sigma_z^2}\right]$$

E: emission [ $\mu\text{g}/\text{ms}^{-1}$ ]  
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 $\sigma_z$ : vertical dispersion coefficient  
z: height of the calculation point [m]  
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un : windspeed in direction n [m/s]  
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n=1 - 12 : number of wind directions

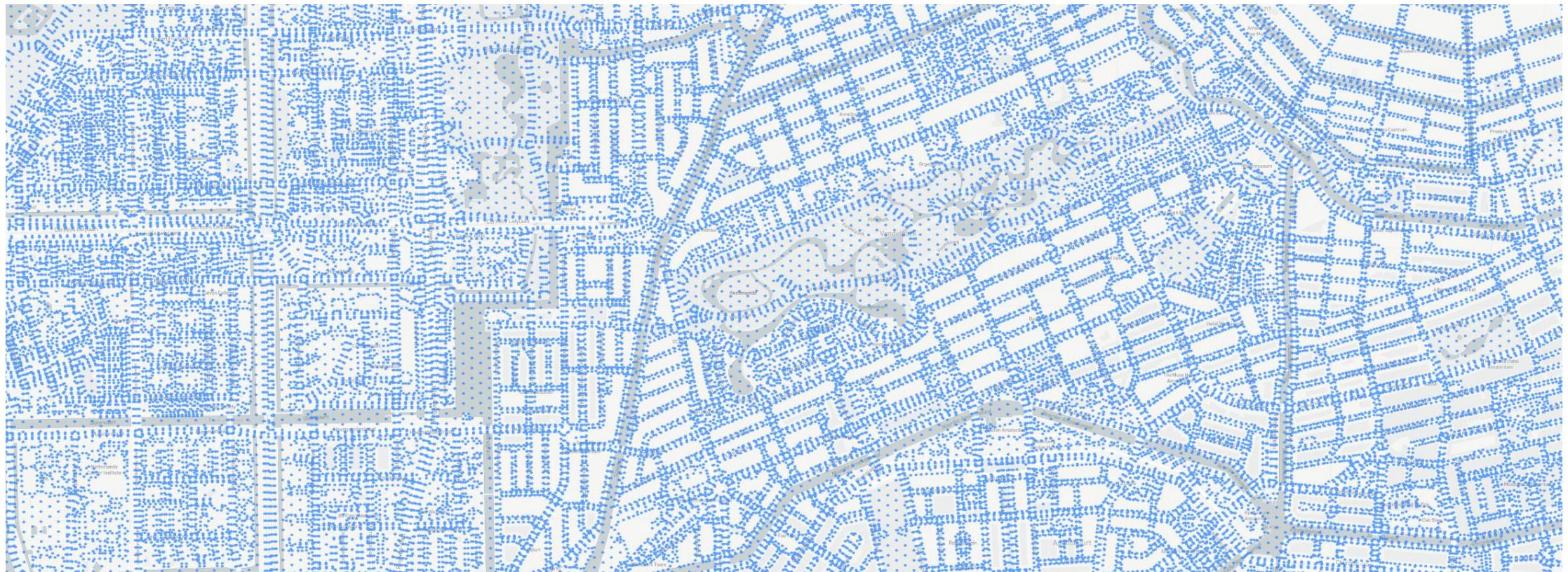
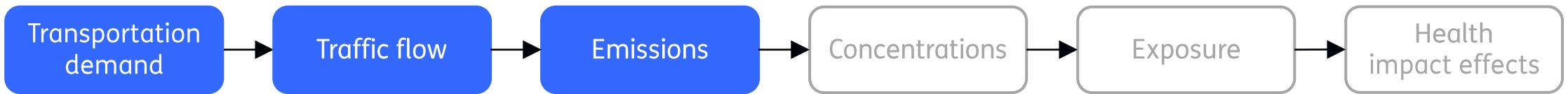


# Air Quality



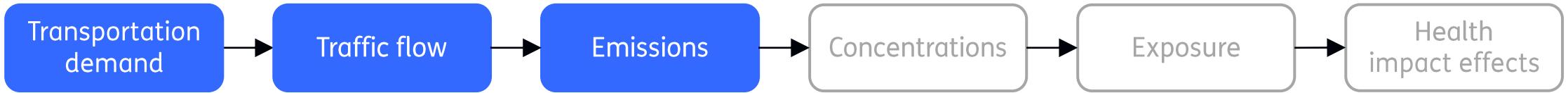
Calculation points: 'receptors'

# Air Quality



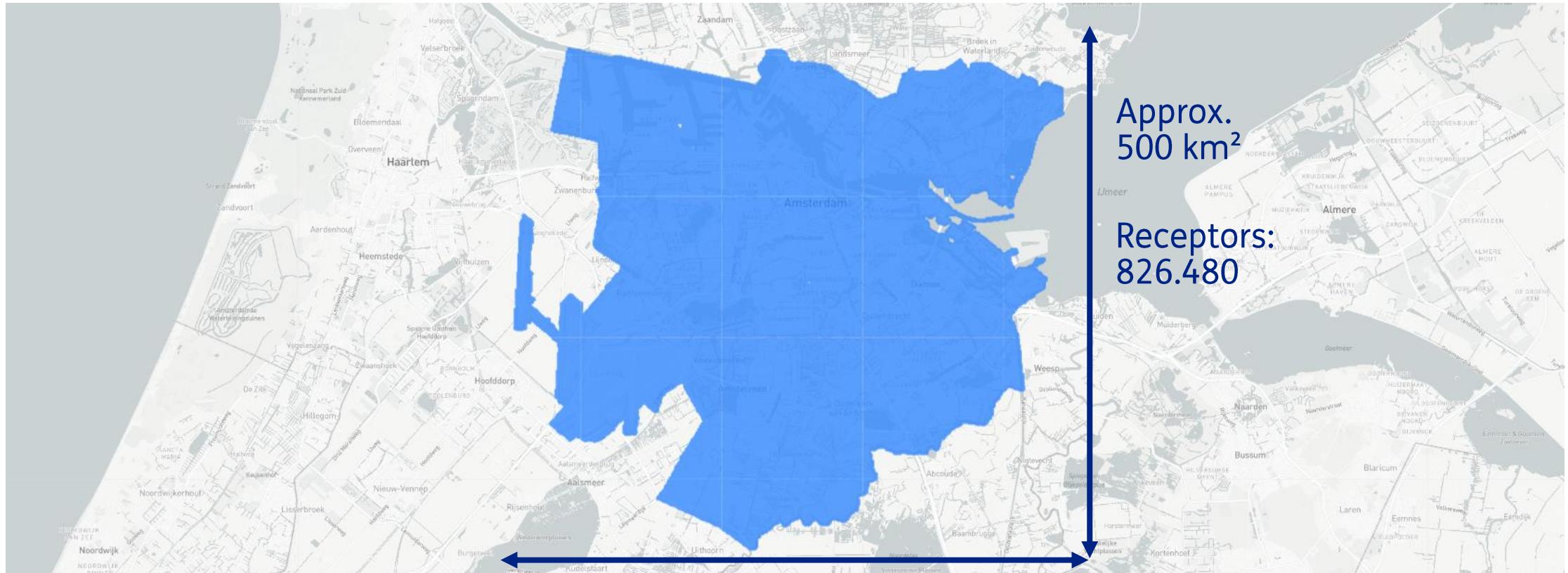
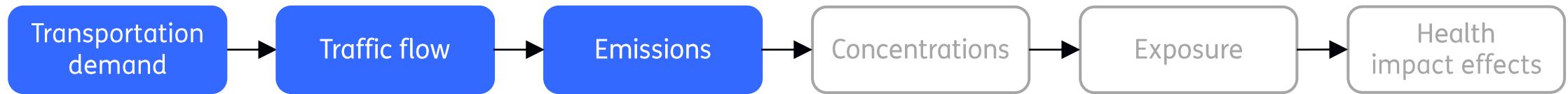
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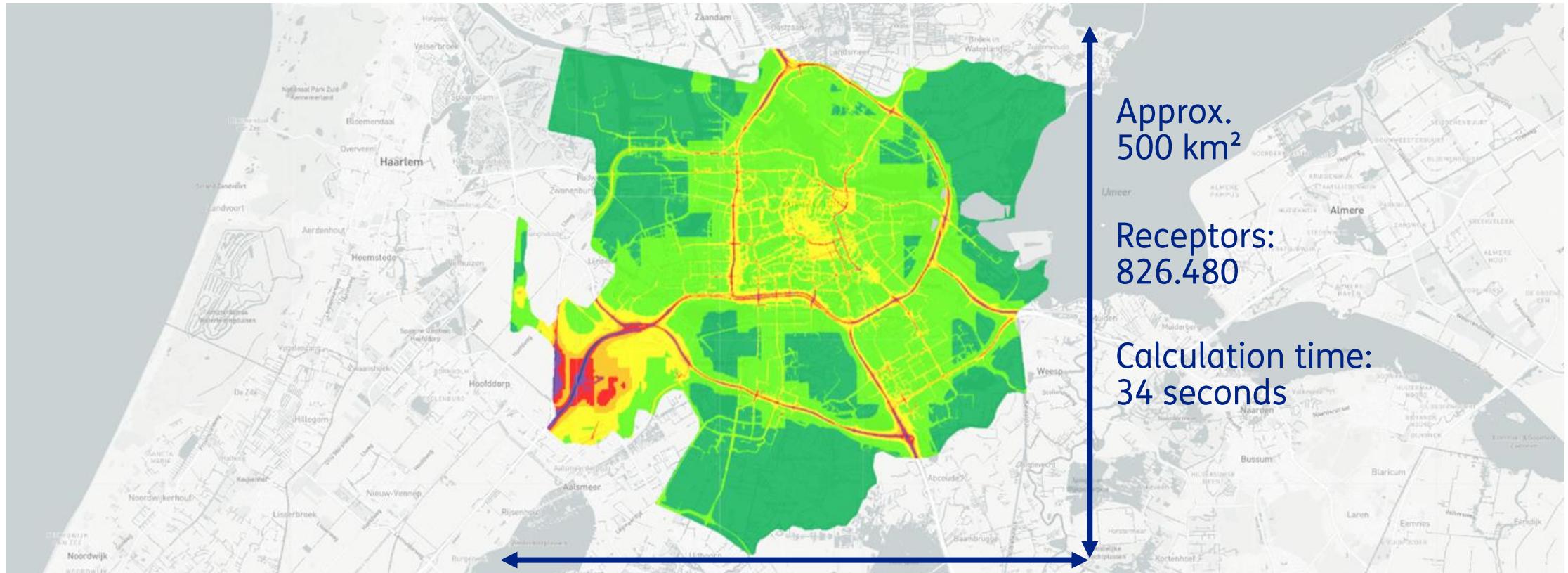
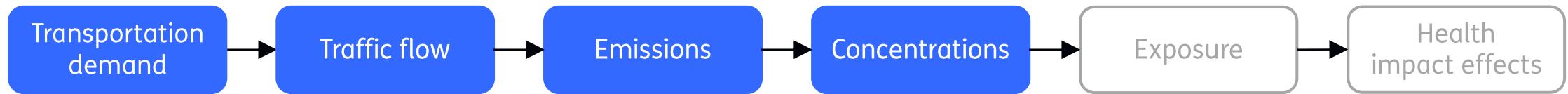
Calculation points: 'receptors'

# Air Quality



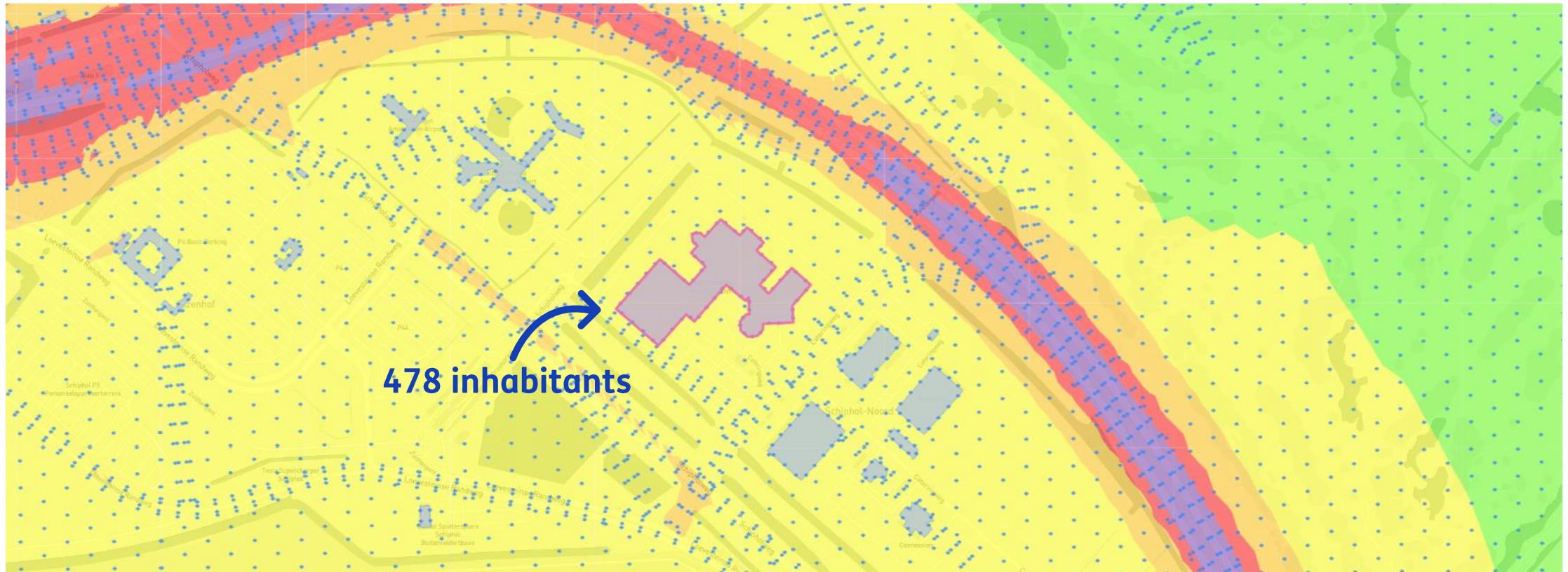
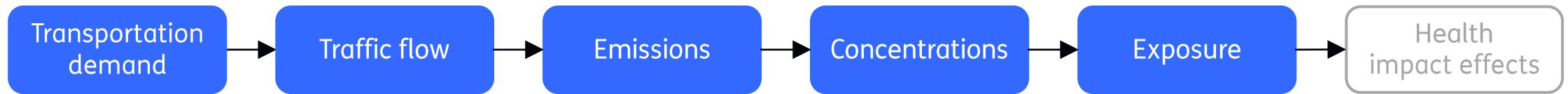
Calculation points: 'receptors'

# Air Quality



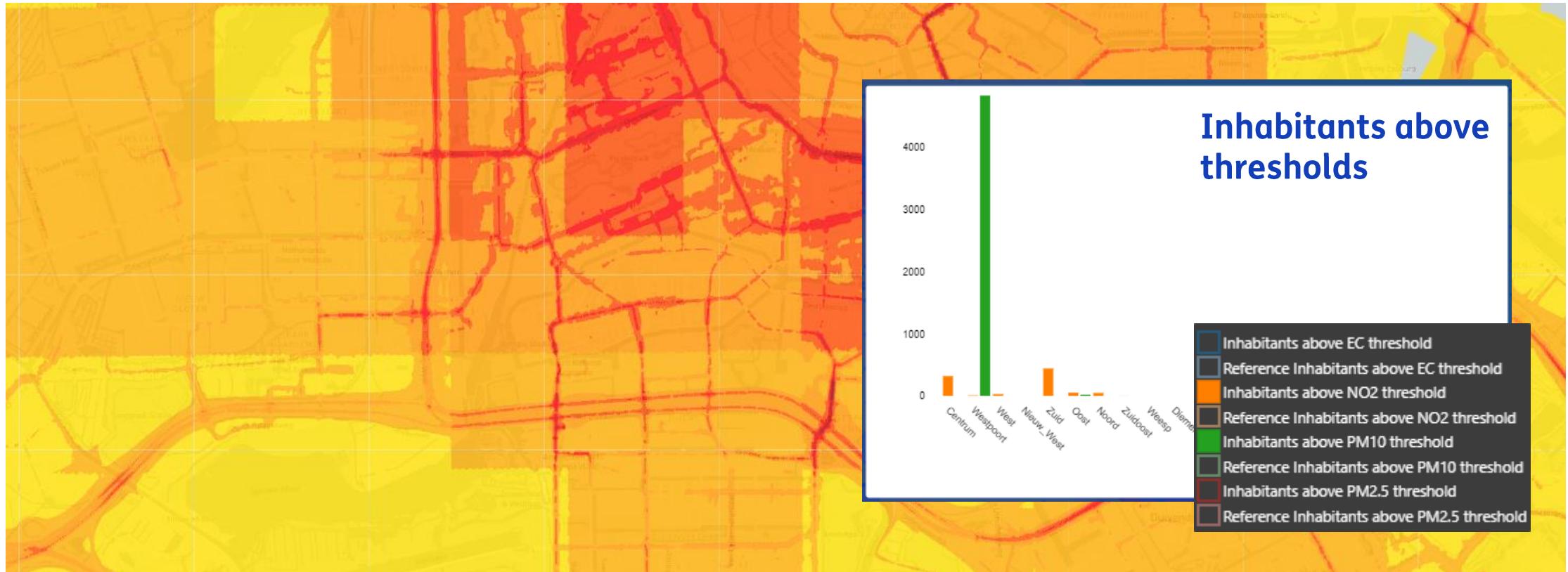
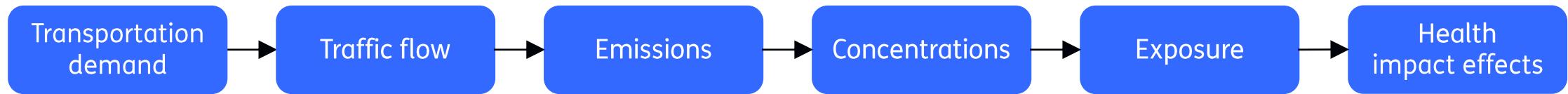
Air quality map: NO<sub>2</sub>

# Air Quality



Air quality map: NO<sub>2</sub>

# Air Quality



Air quality map: PM<sub>10</sub>

# Examples of use cases



Digital Twin city of Amsterdam

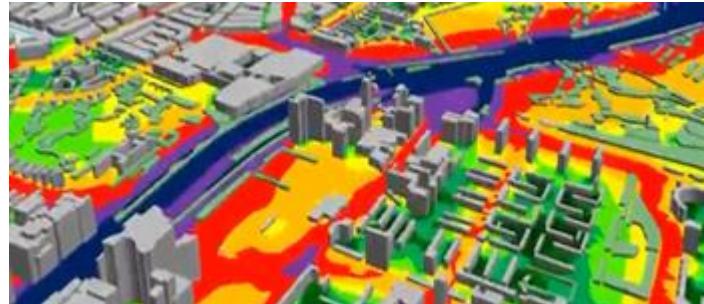
# Examples of use cases



## Challenge

The city is growing within its limited boundaries. Newly built-up areas to be developed

This will lead to increasing pressure on the mobility system and the environment.



## Approach

Jointly identify complex challenges and bottlenecks, using Urban Strategy to assess, monitor and evaluate system interventions.

Close the “learning cycle” and validate assumptions with the real-time data.

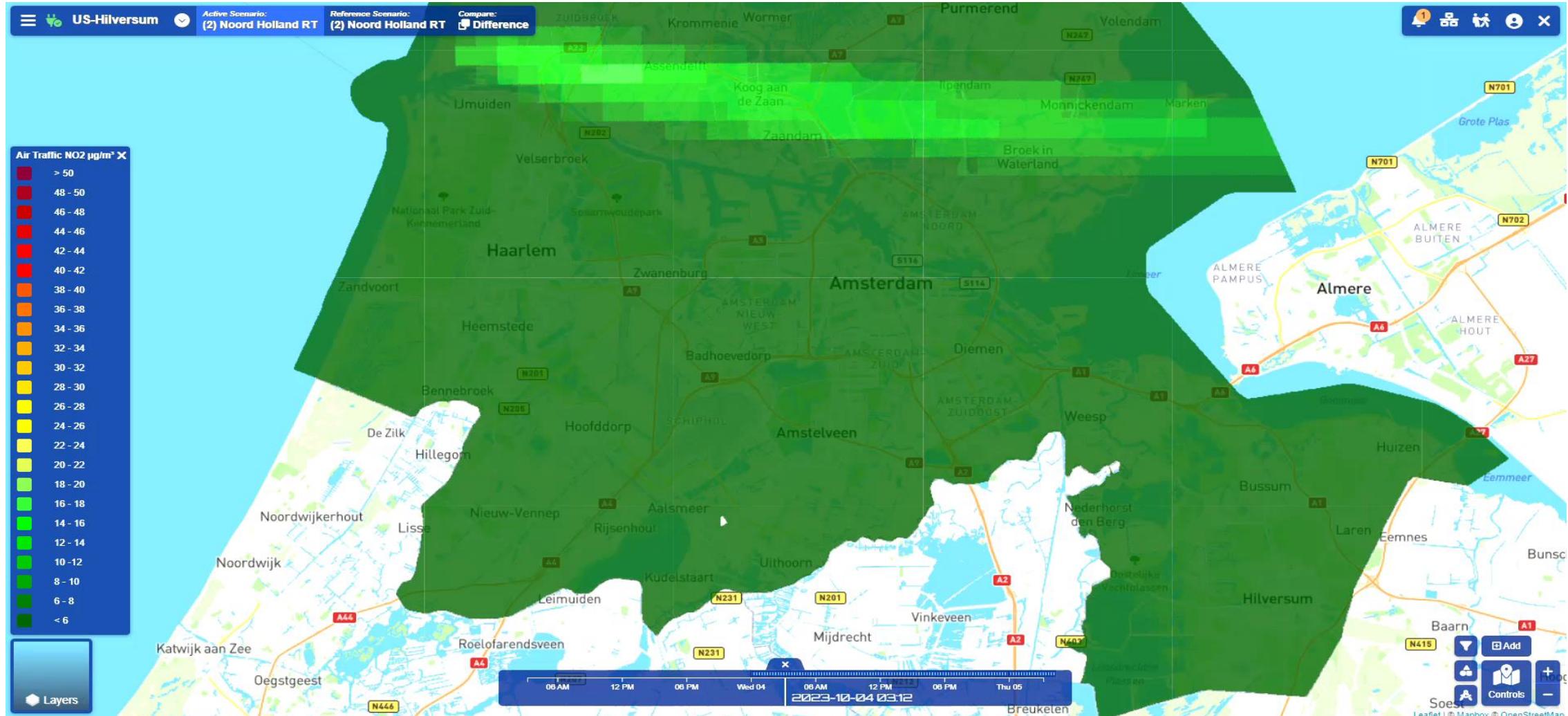


## Results

Continuous support in challenge to redevelop parts of the city while maintaining accessibility.

Currently focused on the redevelopment of the business district: Amsterdam Zuidas

# **Examples of use cases**



# Real time air quality in the Amsterdam region

# Examples of use cases



## Challenge

In many German cities, the legal amounts of NO<sub>2</sub> set by the EU were exceeded. That leads local courts to act against those municipalities, increasing pressure on authorities to implement clean-air plans with quick results.



the mind of movement



## Approach

City authorities in Hannover, Kiel, Heilbronn and Ludwigsburg suggest action plans.

Impact analysis study by PTV Group and TNO, sponsored by Volkswagen, with the use of Urban Strategy.



## Results

The analysis found that a large impact could be attributed to the change of vehicle fleets, i.e. cleaner (or electric) engines.

In all four cities positive impacts of fleet renewal were combined with planning and engineering measures in order to improve air quality quickly.

## NO<sub>2</sub> emission reduction strategies in Germany

<https://blog.ptvgroup.com/en/city-and-mobility/reducing-no2-car-emissions/>

# Examples of use cases



## Challenge

Collaboration on assessment of concrete use-cases and (what-if) scenarios for bus electrification in Singapore.

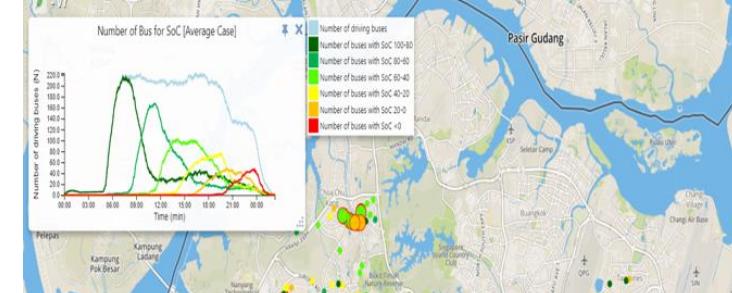
Goal: Complete electrification in 2040 of Singapore's 6.000 buses



## Approach

Assessment framework, development and application of e-Bus simulation model on different scenarios for E-Bus deployment strategies.

Taking into account charging strategies, routing, weather, and so on. Knowledge transfer to the Land Transport Authority (LTA).



## Results

Assessment of use-cases (what-if) scenarios.

Tailored platform for LTA as a central instrument for informed decision making.

# Let's improve our cities together



**Leonard Oirbans**  
Innovation consultant Digital Twins

📍 Den Haag - New Babylon ✉️ [leonard.oirbans@tno.nl](mailto:leonard.oirbans@tno.nl)

📞 +31 6 14 06 47 81

