

# API-IMPLEMENTATION OF AIR POLLUTION MODEL DATA INTO (ROUTING)-APPLICATIONS



Looking for the healthiest cycle route

Image © Google Street View



Informing you on ambient air quality  
in the Belgian Regions

FLANDERS  
ENVIRONMENT AGENCY



### Belgian Interregional Environment Agency (IRCEL - CELINE)

Current Air Quality Measurements:  
 Last update: Wednesday 25 June 2014, 13:00

change time

NO<sub>2</sub> - hourly mean    PM<sub>10</sub> - running 24 hour mean    O<sub>3</sub> - hourly mean

The BASAQMO index

	yesterday (observed)	today (forecast)	tomorrow (forecast)
Belgium	very good - 4	very good - 4	very good - 4
Flanders	very good - 4	very good - 4	moderate - 5
Brussels	very good - 4	very good - 4	moderate - 5
Wallonia	moderate - 5	very good - 4	moderate - 5

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 Deutsch

Email Format

html  
 text

today:

NO<sub>2</sub> (maximum daily 1-hour mean)    PM<sub>10</sub> (daily mean)    O<sub>3</sub> (maximum daily 1-hour mean)

tomorrow:

NO<sub>2</sub> (maximum daily 1-hour mean)    PM<sub>10</sub> (daily mean)    O<sub>3</sub> (maximum daily 1-hour mean)

News - nieuws - nouvelles - Neuigkeiten

Gaat het met luchtkwaliteit in ons land effectief de slechte kant op?

May 04, 2014

Annual Report Air Quality in Belgium 2011

Mar 20, 2012

More...

# IRCEL-CELINE

- <http://www.irceline.be>
- Real-time data
  - All major pollutants (incl. BC)
  - Forecasts
  - Information about pollutants
  - Publications
  - etc.

Integration of OGC-services (download and viewing) into website

... and tables with (real-time) data:

irCELINE  
 Informing you on ambient air quality in the Belgian Regions

NL EN FR DE

Search Site

You are here: Home / Air Quality / Measurements / Nitrogen Dioxide

### Nitrogen Dioxide

RIO Interpolation map    table with detailed info per monitoring site

search for address:

Measurements

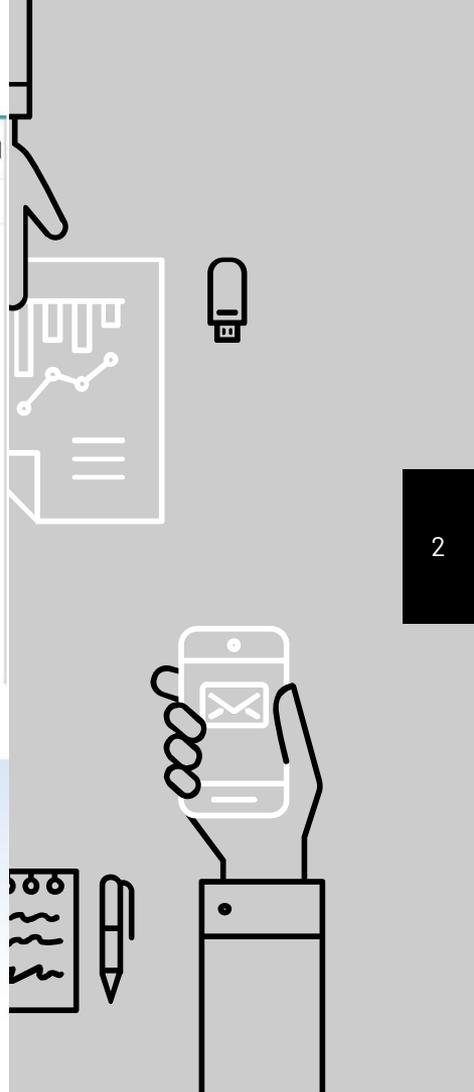
- Particulate Matter
- Ozone
- Nitrogen Dioxide
  - Information
  - Last 15 days
  - Exceedances
  - History
  - Forecast
  - RIO-Item annual mean 2012
- Air Quality Index
- Meteorological Observations
- Monitoring Stations

### Nitrogen Dioxide

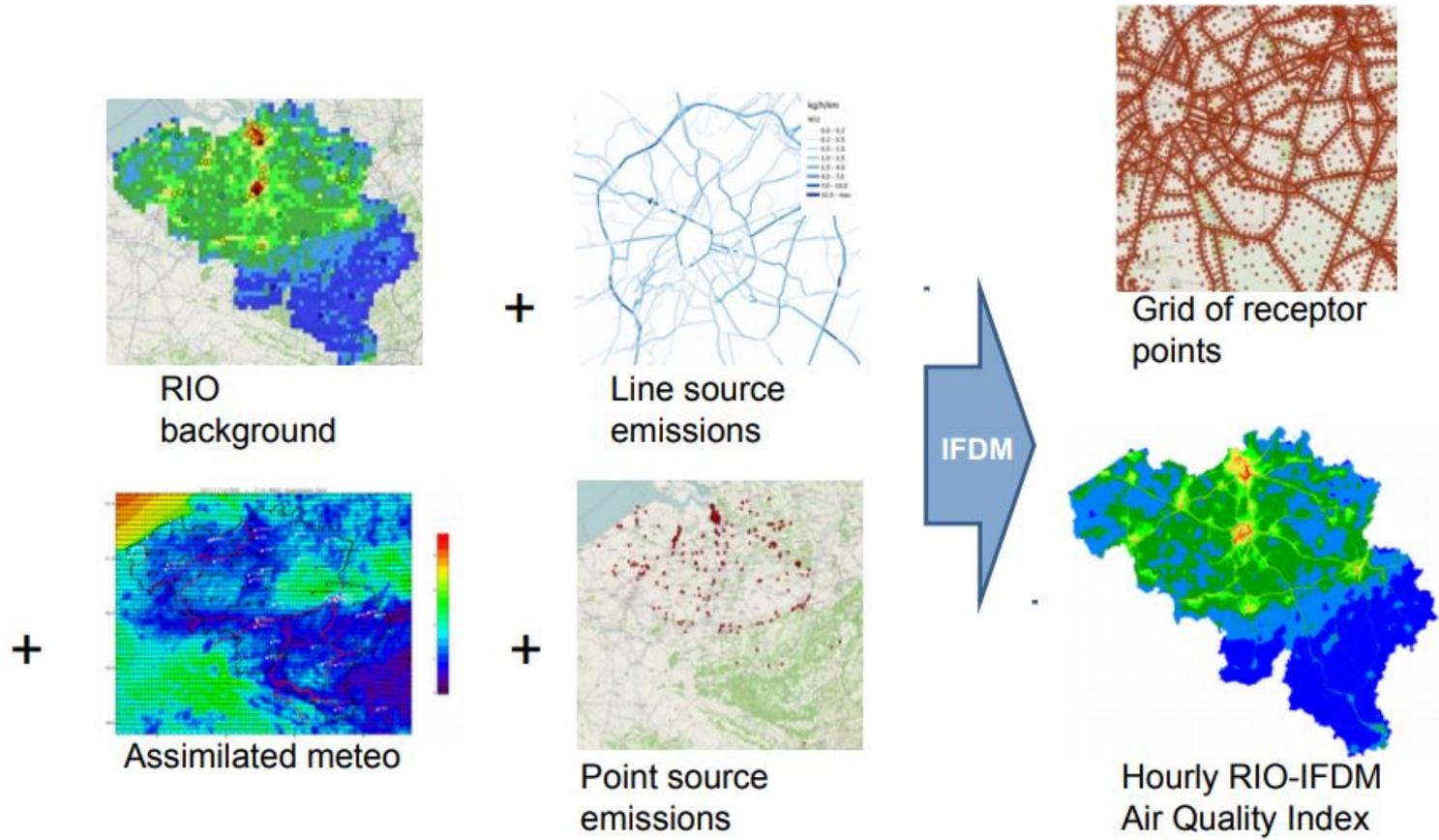
RIO Interpolation map    table with detailed info per monitoring site

Tuesday 19/1/2013: 16:00 update (local time)  
 For detailed information click on station codes

STATION		Actual values	highest 1-hour average today	data received
code	city	µg/m <sup>3</sup>	µg/m <sup>3</sup> (local time)	hh
418004	Brussel (Sint-Katelijne)	45	70	10:00 16:00
418006	Brussel (EU-Parlement)	50	65	11:00 16:00
418008	Brussel (Bellardstraat)	81	95	10:00 16:00
418011	Sint-Agatha-Berchem	34	43	10:00 16:00
418041	Neder-Over-Heembeek	48	49	10:00 14:30
418042	Voorhaven (Haren)	43	81	09:00 16:00
418001	Sint-Jans-Molenbeek	58	69	10:00 16:00
418002	Etienne	84	91	10:00 16:00
418012	Likiep	34	53	11:00 16:00
418044	Sint-Lambrechts-Woluwe	56	71	10:00 16:00
476013	Vorst	35	60	10:00 16:00
400801	Oostrozbeke	18	33	01:00 16:00



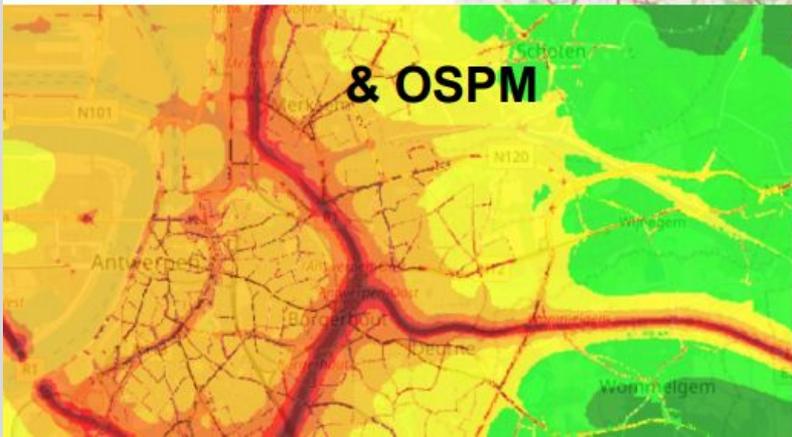
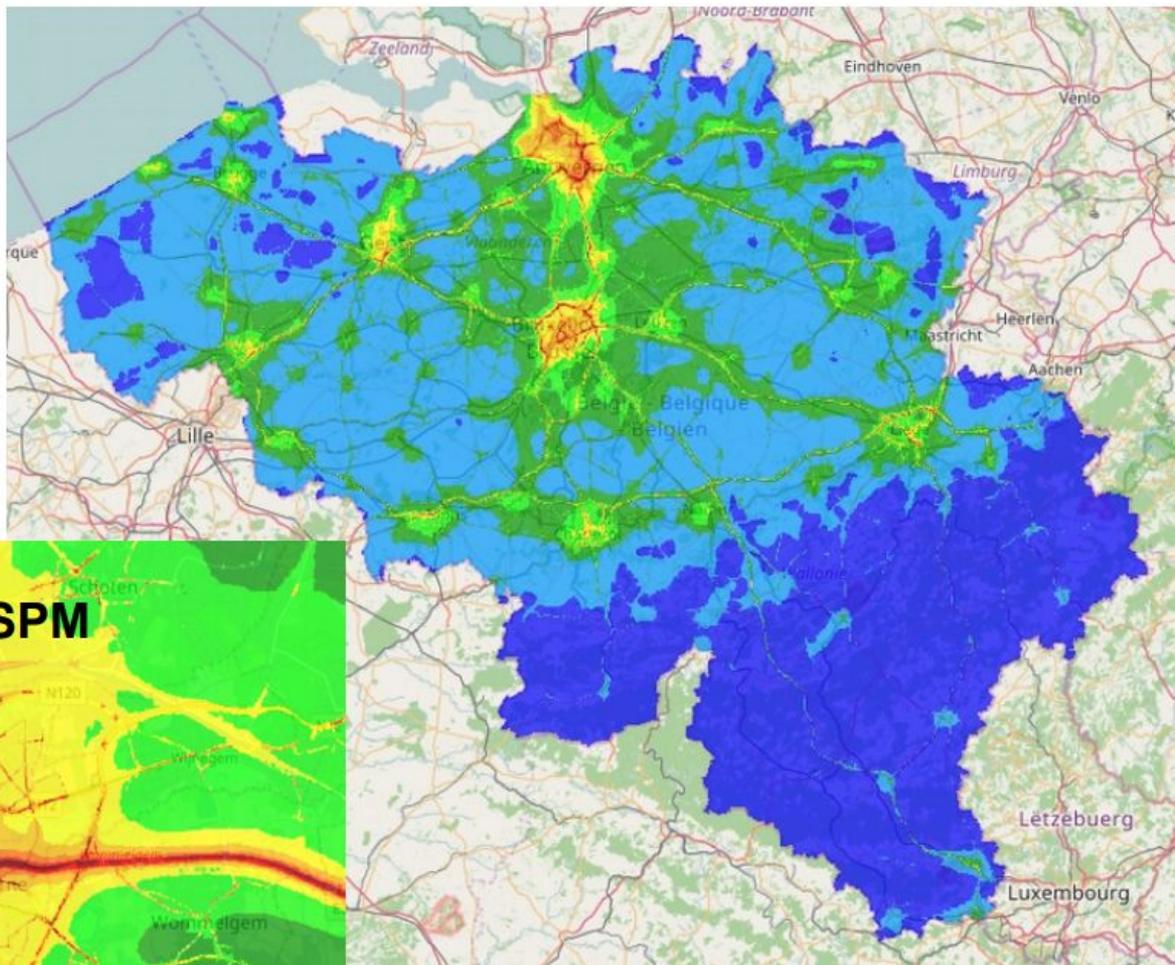
# Hi resolution air quality model



# Hi resolution model (RIO-IFDM)

Nitrogen dioxide  
(NO<sub>2</sub>)  
annual mean

microgram/m<sup>3</sup>



# FUTURE MODEL IMPROVEMENT?

Citizens science measurement campaign  
(20000 samples across Flanders)



Further model improvement based on measurements

Testing of potential of low-cost sensors

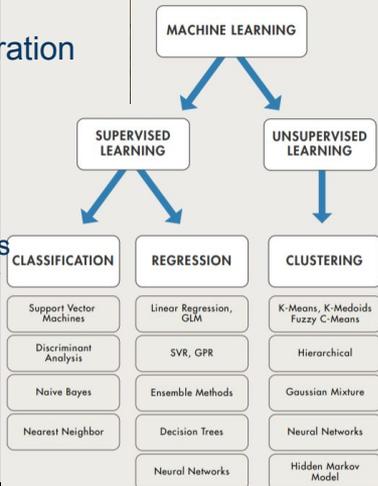


Validation & calibration



Use of measurements  
'qualified sensors' for  
model improvement

Selecting an Algorithm © mathworks



Improve definition & modelling of  
Street Canyons



Improved traffic emission data



## Issue

The air quality on the routes you take is poor and this is not visible.



## Aim

Provide a quality assured, scientifically sound data endpoint which can be used by any existing routing application to identify the healthiest route alternative.

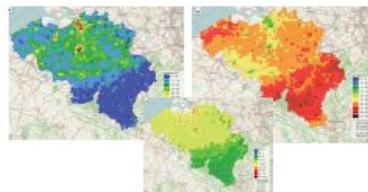


## Targeted Public

Pedestrians, cyclists, commuters, planners, the public in general.

## API Healthiest Route

### Context



Existing data endpoint are geared to users with sufficient expertise to interpret the information.

### Need

Make impact of poor air quality more tangible to non-expert users.

### Transnational Twinning

Département du Loiret and all consortium members who plan to use hackathons to refine the idea.

## Necessary data



## Planning and realisation

Q1-2 2017: develop data exchange model  
Q1 2019: API  
Q1 2020: demo implementation in a routing app



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€ 8,000,000,000<sub>BE</sub>

Lost work days  
Sick days  
Healthcare  
Agriculture

### Chronic

- Lung cancer
- Brain damage
- Brain cancer
- Increase in number of asthma exacerbations

12,580<sub>BE</sub>

467,000<sub>EU</sub>

### Acute

- Respiratory problems
- Acute asthma exacerbation
- Decreased lung function
- Cardiovascular problems, Heart attacks (strokes)

## Causes of air pollution



$\text{NO}_2$  , BC ,  $\text{PM}_{2.5}$  , VOC, ...

Remark: air pollution  $\neq$  climate change  
E.g. planes: very limited impact on air pollution

Air pollution  $\neq$   $\text{CO}_2$



$\text{PM}_{2.5}$  ,  $\text{PM}_{10}$  , ...

**Traffic** (cars, diesel cars, trucks) is by far the most important cause of air pollution exposure to pedestrians and cyclists in Flanders, followed by **households** (especially wood stoves; less important in summer). Also **agriculture** and **industry** contribute to some extent.

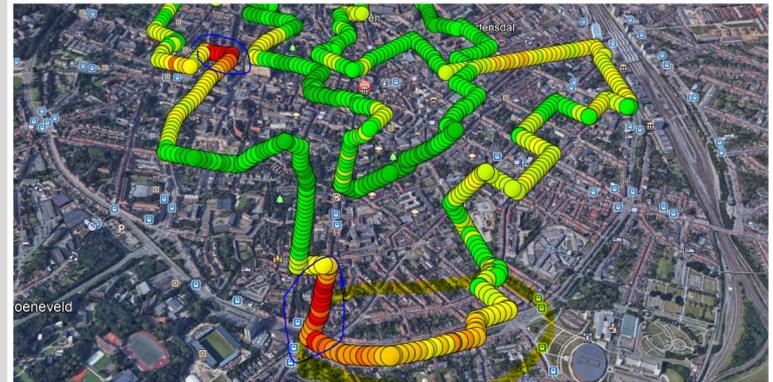


## We can reduce air pollution exposure for cyclists and pedestrians by

- 1 Smart-design of cycle paths, separated from traffic.
- 2 Reduce traffic, ban/tax cars, ban/tax wood stoves.
- 3 **Developing an application simulating healthiest route, encouraging people to choose a healthier route alternative.**
- 4 Raising awareness for causes of air pollution.
- 5 In general , cyclists and pedestrians are recommended to avoid as much as possible **'city rings'** and **car-busy 'street canyons'**.

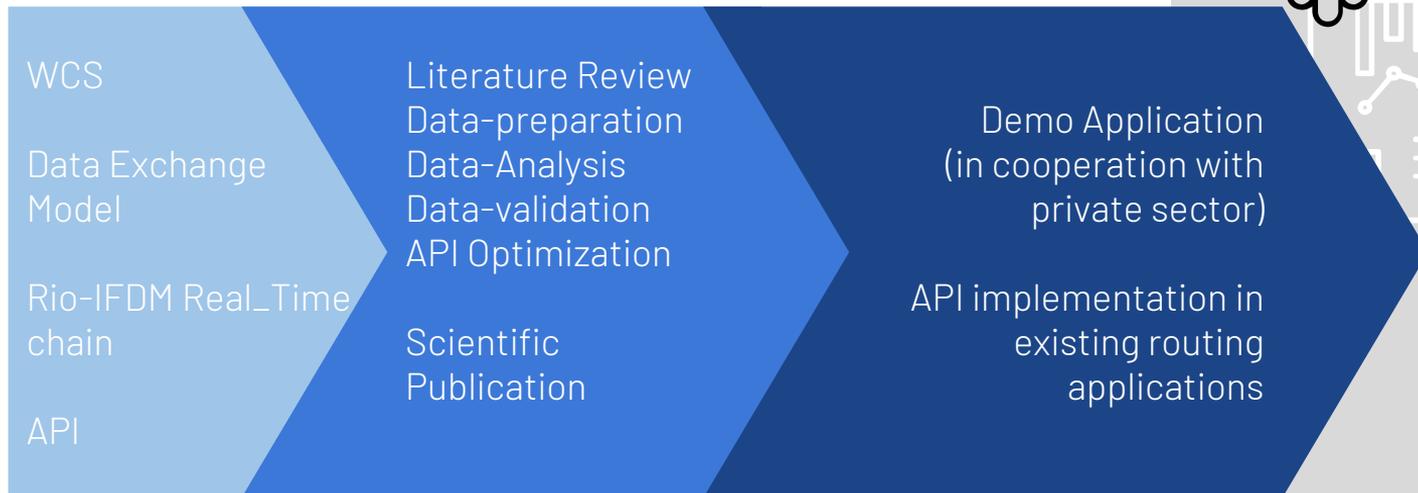
Trajectory measurements of Black carbon in peak hours, May-June 2016, Leuven, Belgium

The overview of those measurements confirms that in generally, the city ring is the most polluted, with only some small exceptions, the car-busy 'Street Canyons' (very small streets with high buildings).



(based on data of (Leuven 2030))

# OUR PROCESS



### 3 “end products”

- Scientific publication
- Demo application
- Implementation of API



## Traffic Road (Antwerp, BE)

Measurements (mean):  $3.38 \mu\text{g}/\text{m}^3$

**+256% vs. Bicycle highway**  
(measurements)



## Bicycle Highway (Antwerp, BE)

Measurements (mean)  $1.32 \mu\text{g}/\text{m}^3$

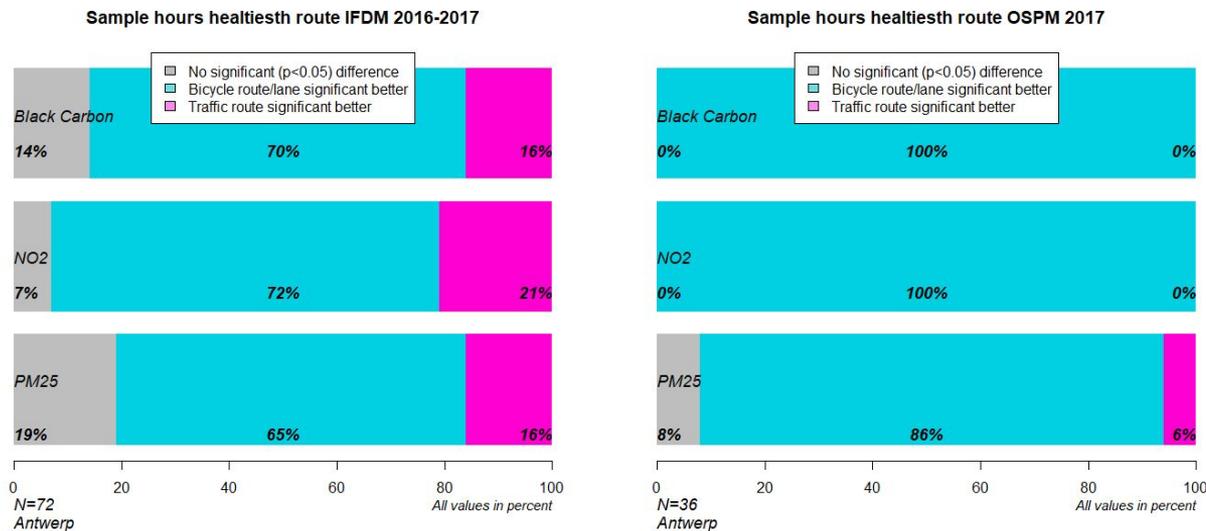


Comparing with results of:

Hofman, J. *et al.* "Cyclist exposure to black carbon, ultrafine particles and heavy metals: An experimental study along two commuting routes near Antwerp, Belgium." *Environmental Research*. Volume 164, July 2018, Pages 530-538

# Significant difference in air quality for different route alternatives ?

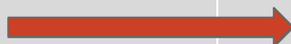
Based on t.test



If we simulate for 72 randomly selected dates, the healthiest route at 08h, 13h and 17h, the IFDM real time chain suggests that the bicycle highway is the best choice in 70% of the cases and the traffic route 16% of the time.

According to OSPM, the bicycle highway is better 100% of the time for BC and NO2, which is also suggested by the measurements and very likely is true.

**IFDM Real Time wrongly suggests to prefer traffic road in some cases because of serious underestimation of air pollution on high-traffic roads and street canyons, and a simulated difference in air pollution between bicycle highways and traffic roads that is far below the differences of trajectory measurements.**



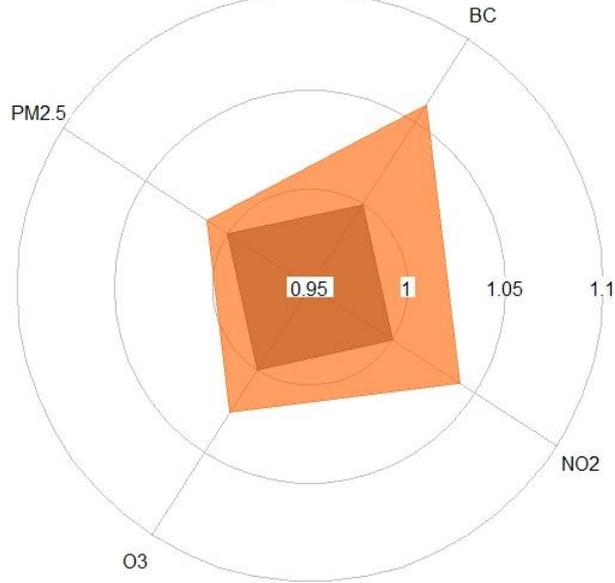
**Real Time RIO-IFDM chain not suitable to use for implementation in routing applications**

# Comparison of pollutants annual model maps

Bicycle highway=1.0 for each pollutant

Air pollution: Traffic road and bicycle highway by comparison

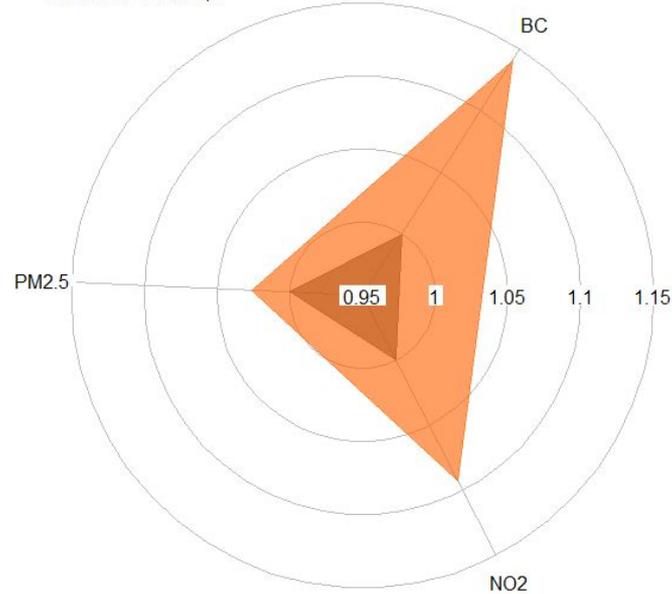
2016 annual IFDM maps



Bicycle highway=1.0 for each pollutant

Air pollution: Traffic road and bicycle highway by comparison

2016 annual OSPM maps



## Comparison with pollutants

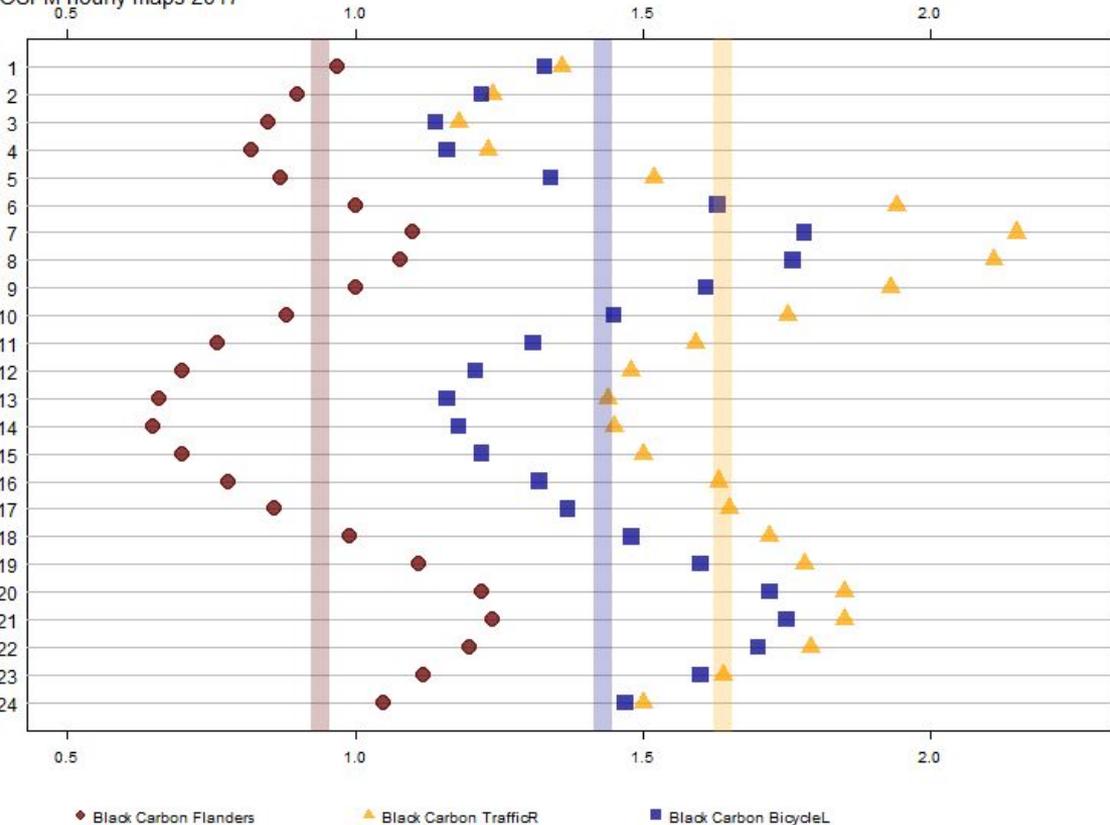
Left: Difference for pollutants between bicycle highway and traffic road for IFDM annual map (e.g. BC : 6% difference, NO2: 4% difference)

Right: same for OSPM (Atmostreet) Map (e.g. BC: 14% difference, NO2 10% difference between traffic road and bicycle highway)

# Daily pattern of air pollution concentrations (annual, 2016)

Black Carbon for Flanders, Bicycle Highway Antwerp and Traffic road Antwerp

OSPM hourly maps 2017



*Average hourly Black Carbon (BC) concentrations for 2016 of Flanders (brown), a cycle-highway in Antwerp (blue) and a traffic-busy road in Antwerp (yellow). The vertical bars represent the daily average.*

*Model: OSPM-ATMOSTREET static annual hourly maps*

# Same results if we repeat analysis for other routes at other locations (e.g. Leuven, 3 routes)

Naamloze kaart  
3 weergaven

Alle wijzigingen opgeslagen in Drive

Laag toevoegen + Delen  
Voorbeeld weergeven

route\_alternative1.gpx  
Individuele stijl

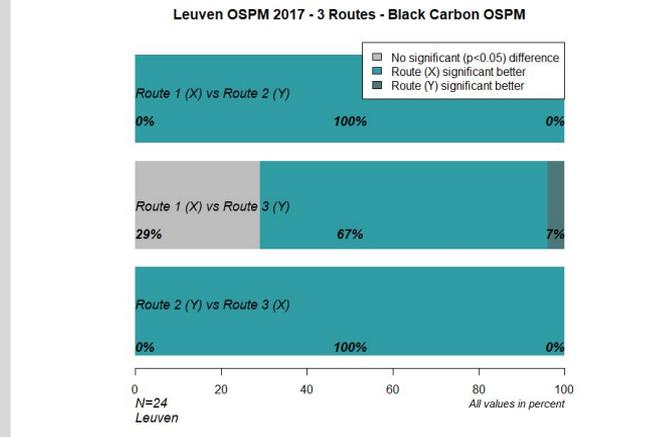
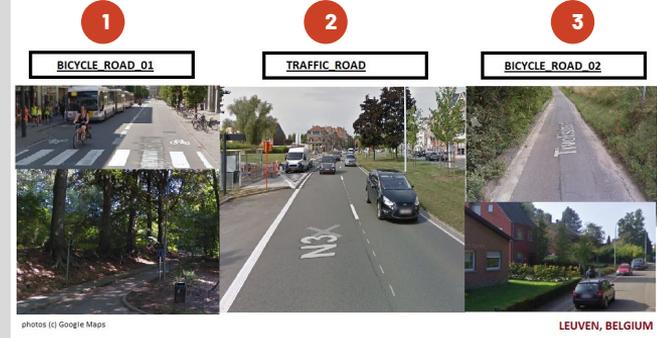
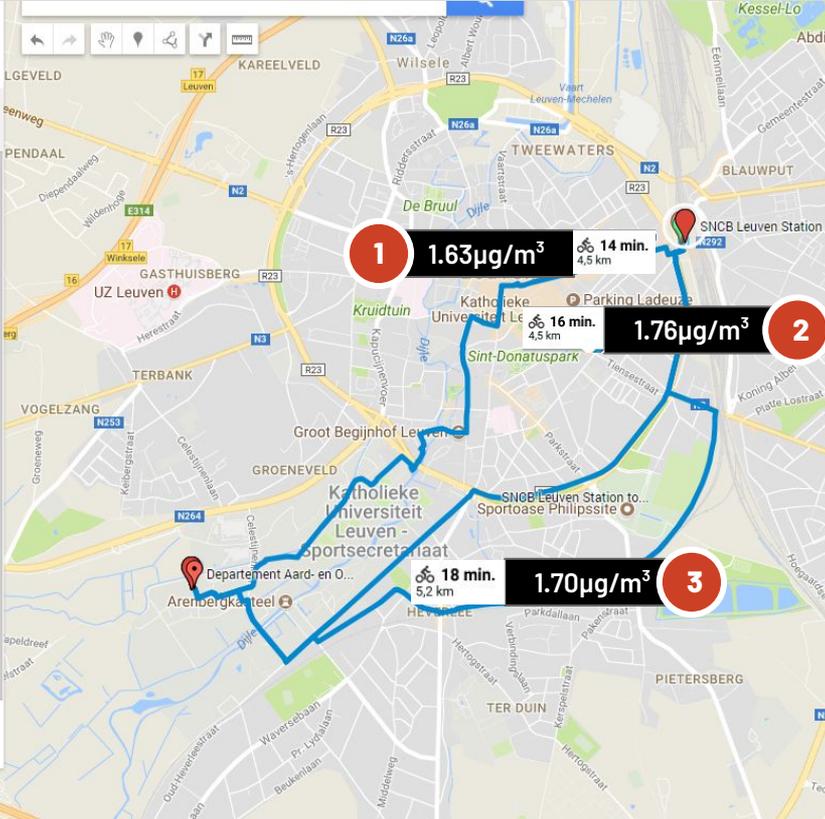
- SNCB Leuven Station
- Departement Aard- en Omge...
- Startpunt van SNCB Leuven ...
- Eindpunt van SNCB Leuven ...
- SNCB Leuven Station to Dep...

route\_alternative2.gpx  
Individuele stijl

- SNCB Leuven Station
- Departement Aard- en Omge...
- Startpunt van SNCB Leuven ...
- Eindpunt van SNCB Leuven ...
- SNCB Leuven Station to Dep...

route\_alternative3.gpx  
Individuele stijl

- 50.8812791
- Departement Aard- en Omge...
- Startpunt van 50.8812791 to...
- Eindpunt van 50.8812791 to...

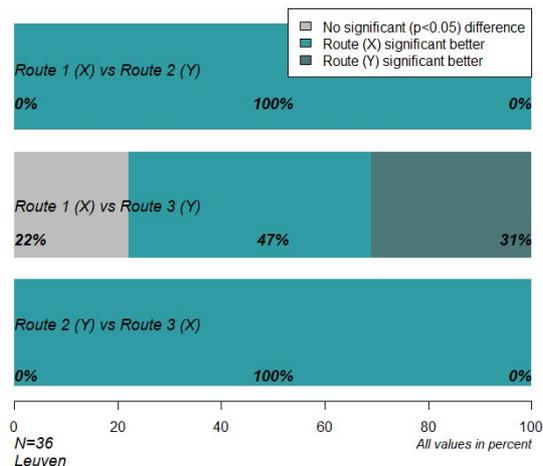


For similar (time, distance) route alternatives, there is in most cases a route with significant lower air pollution concentrations

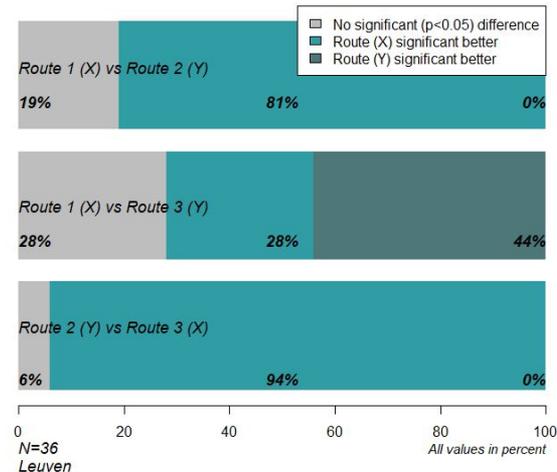
BC seems to be most suitable pollutant to use

- Most correlated with traffic than other pollutants including NO2
- (somewhat) More correlated with PM 2.5 than NO2
- BC is most damaging pollutant in terms of health effects

Leuven IFDM 2016 - 3 Routes - Black Carbon IFDM



Leuven IFDM 2016 - 3 Routes - NO2



# Model Evaluation: Overall score based on 5 measures

<b>COE</b>	Tells something about predictive advantage of model
<b>R<sup>2</sup></b>	Important insights in the spatial correlation between observations and model
<b>FAC2</b>	Tells which % of the modelled value is unacceptable far from the observation
<b>RMSE</b>	Overall performance measure of how close modelled values are to observed values
<b>IOA</b>	Average relative error, comparing model deviations with observed deviations from the mean The index of agreement can detect additive and proportional differences in the observed and simulated means and variances

### Root mean squared error, RMSE

The RMSE is a commonly used statistic that provides a good overall measure of how close modelled values are to predicted values.

$$RMSE = \left( \frac{\sum_{i=1}^n (M_i - O_i)^2}{n} \right)^{1/2} \quad (22)$$

### Fraction of predictions within a factor of two, FAC2

The fraction of modelled values within a factor of two of the observed values are the fraction of model predictions that satisfy:

$$0.5 \leq \frac{M_i}{O_i} \leq 2.0 \quad (17)$$

### Correlation coefficient, r

The (Pearson) correlation coefficient is a measure of the strength of the linear relationship between two variables. If there is perfect linear relationship with positive slope between the two variables,  $r = 1$ . If there is a perfect linear relationship with negative slope between the two variables  $r = -1$ . A correlation coefficient of 0 means that there is no linear relationship between the variables. Note that `modStats` accepts an option `method`, which can be set to "kendall" and "spearman" for alternative calculations of  $r$ .

$$r = \frac{1}{(n-1)} \sum_{i=1}^n \left( \frac{M_i - \bar{M}}{\sigma_M} \right) \left( \frac{O_i - \bar{O}}{\sigma_O} \right) \quad (23)$$

### Coefficient of Efficiency, COE

The *Coefficient of Efficiency* based on Legates and McCabe (2012) and Legates and McCabe Jr (1999). There have been many suggestions for measuring model performance over the years, but the COE is a simple formulation which is easy to interpret.

A perfect model has a COE = 1. As noted by Legates and McCabe although the COE has no lower bound, a value of COE = 0.0 has a fundamental meaning. It implies that the model is no more able to predict the observed values than does the observed mean. Therefore, since the model can explain no more of the variation in the observed values than can the observed mean, such a model can have no predictive advantage.

For negative values of COE, the model is less effective than the observed mean in predicting the variation in the observations.

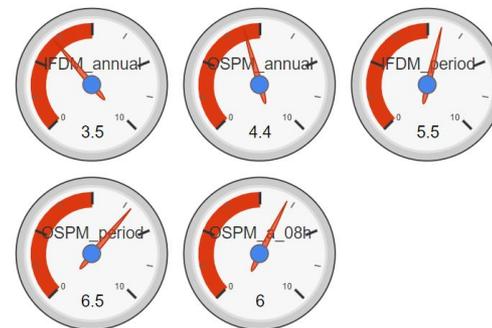
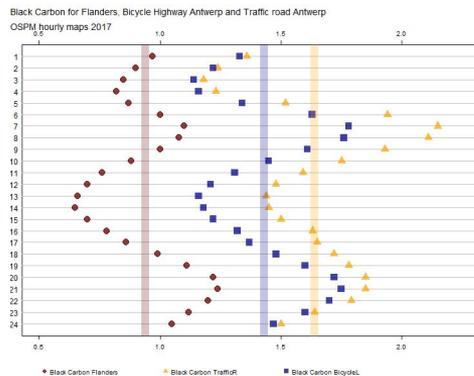
### Index of Agreement, IOA

The *Index of Agreement*, IOA is commonly used in model evaluation (2011). It spans between -1 and +1 with values approaching +1 indicating better model performance. An IOA of 0.5, for example, indicates that

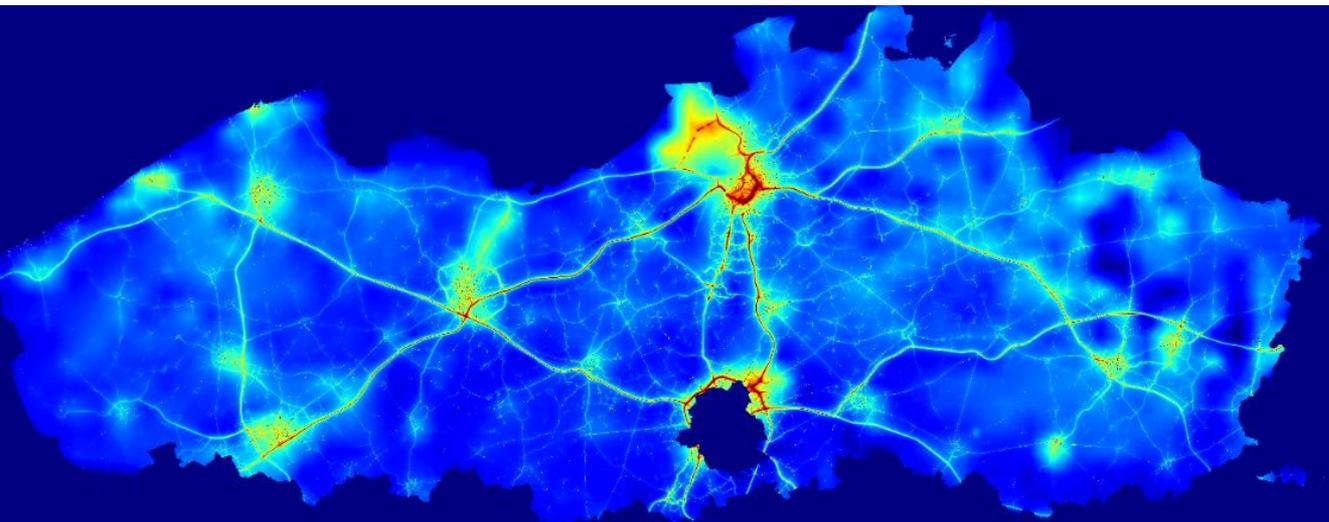
$$IOA = \begin{cases} \frac{\sum_{i=1}^n |M_i - O_i|}{\sum_{i=1}^n (|O_i - \bar{O}| + |M_i - \bar{M}|)}, & \text{when } \sum_{i=1}^n |M_i - O_i| \leq \sum_{i=1}^n (|O_i - \bar{O}| + |M_i - \bar{M}|) \\ \frac{\sum_{i=1}^n (|O_i - \bar{O}| + |M_i - \bar{M}|)}{\sum_{i=1}^n |M_i - O_i|} - 1, & \text{when } \sum_{i=1}^n |M_i - O_i| > \sum_{i=1}^n (|O_i - \bar{O}| + |M_i - \bar{M}|) \end{cases}$$

OSPM annual-hourly maps seem to be by far the best in terms of performance , in all cases (yearly maps of hourly air quality : OSPM 00h, 01h, 02h, 03h, ...)

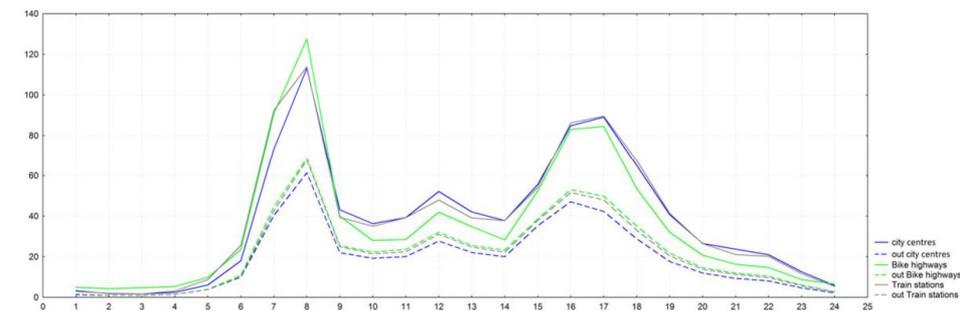
- OSPM annual maps always beat IFDM annual maps
- Real-time IFDM unsuitable (see higher), real-time OSPM not yet available



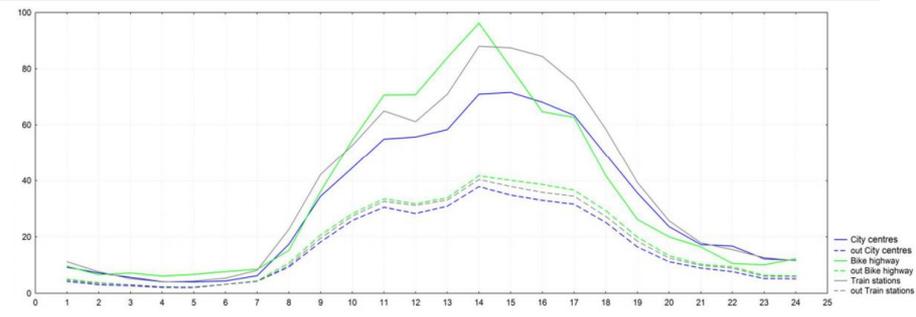
Data: score • Chart ID: GaugeID49986ebc2e86 • googleVis-0.6.2  
R version 3.4.4 (2018-03-15) • Google Terms of Use • Documentation and Data Policy



*Black carbon map of flanders  
Atmostreet model  
Annual mean 08h*



Evolution of number of cyclists on weekdays during day on counting points (fietstelweek, 2016).



Evolution of number of cyclists in weekend during day on counting points (fietstelweek, 2016)

# End product 1: Scientific Publication

## Scientifically sound methodology to implement air pollution data in (routing) apps

### A scientifically sound methodology to include air pollution (model) data in routing applications

B. Vandenindien<sup>1</sup>, XXX<sup>1</sup>, XX<sup>2</sup>

<sup>1</sup>Belgian Interregional Environment Agency, Brussels, Belgium

<sup>2</sup>XXX

**Keywords:** air pollution, cyclist exposure, model evaluation, routing.

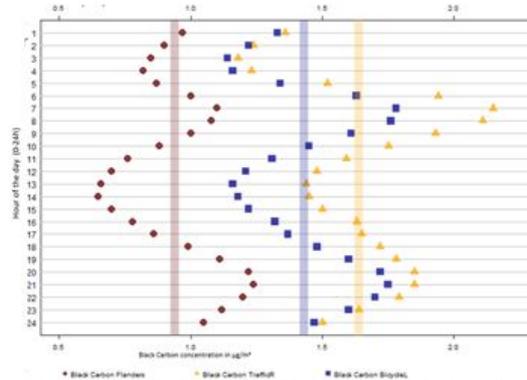
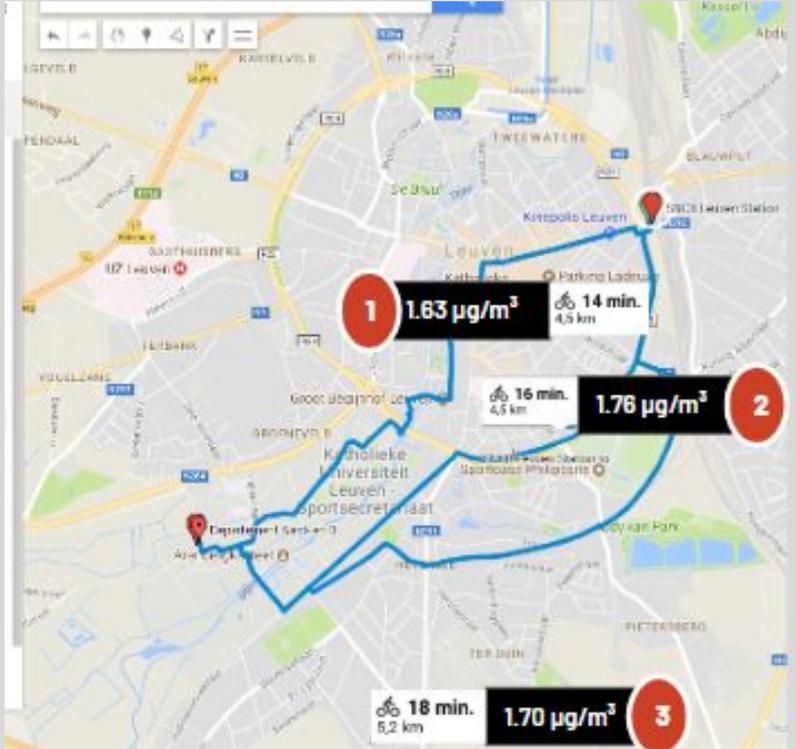


Figure 1. Average hourly Black Carbon (BC) concentrations for 2016 of Flanders (brown), a cycle-highway in Antwerp (blue) and a traffic-busy road in Antwerp (yellow). The vertical bars represent the daily average. Model: OSPM-ATMOSTREET static annual hourly maps

Cyclists and pedestrians often commute in polluted air without being aware of it. Due to their physical effort during travel, they inhale during travel more the air pollution compared to other transport modes (Parkov *et al.*, 2014). We will provide an API that can be used to incorporate air quality in routing applications (or in

seems to be the most suitable pollutant to use in such an application. To choose the best available model, we compare our best available air quality models with trajectory measurements of Black Carbon in the Antwerp, Leuven and Mechelen area. The real-time chain of the high-resolution IFDM model is unsuitable to

## End product 2: Demo application



Cooperation with existing routing planner or new app based on existing routing API

# End product 3: Implementation of API in many different routing apps and recreational apps (?)

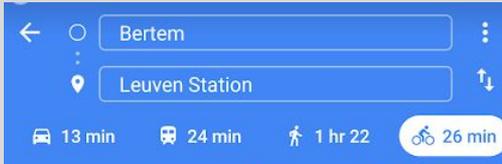


February 4, 2018 at 4:47 PM

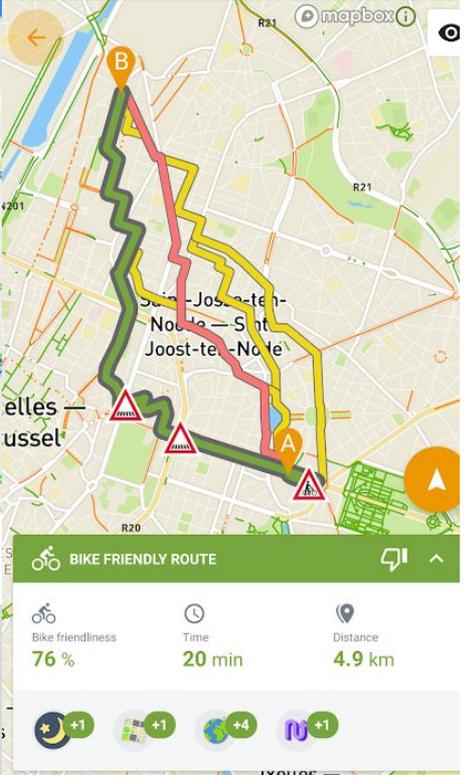
## Late afternoon run&walk mix

Distance 11.7 km  
Pace 10:08 /km

Achievements 5



26 min (8.2 km)  
Mostly flat



Only for pedestrians and cyclists, not for cars!!!



## Financial benefits for the company

- Advertising
- Money from customers (e.g. free version with ads, pay version without ads, but same content)
- Initial funding from Be-GOOD project (only demo-application)



(1)

## Value proposition

## Quality label, permanent quality control

- Cooperation with IRCEL-CELINE guarantees permanent quality control
- Cooperation with IRCEL-CELINE provides a kind of 'quality label' to the designed application



(4)

## Societal benefits

- Reduced Health Care costs, increased productivity, ...
- (possibly) increased traffic safety, reduction of traffic casualties (indirectly people are suggested to take route with fewer cars)
- Acquisition of knowledge



(2)

## Benefits for individuals

- Health benefits: less respiratory problems, less strokes (cardiovascular attacks) (short term), reduced cancer risk (long term)



(4)