

# The Shortest Path Problem in Emergency Vehicle Routing

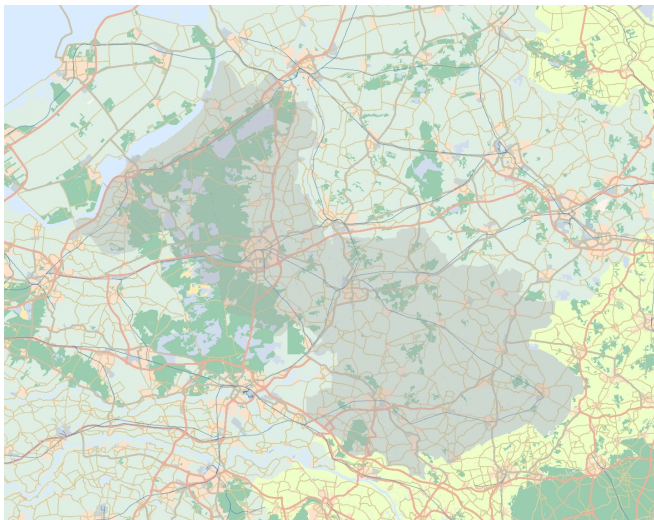
Henk Post



June 26<sup>th</sup>, 2014

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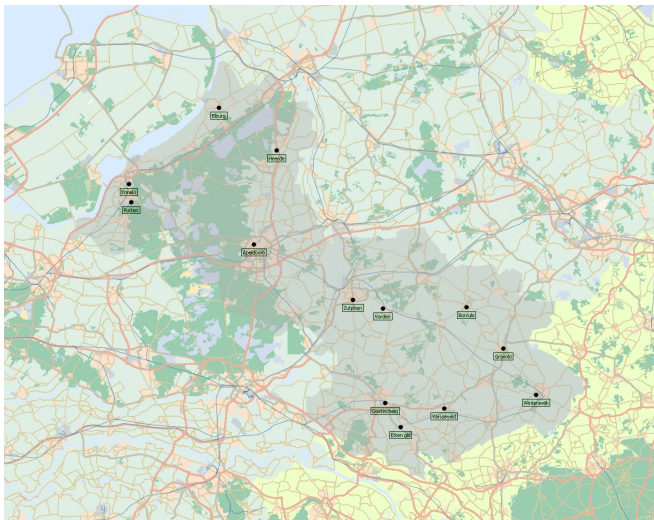
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21 Municipalities

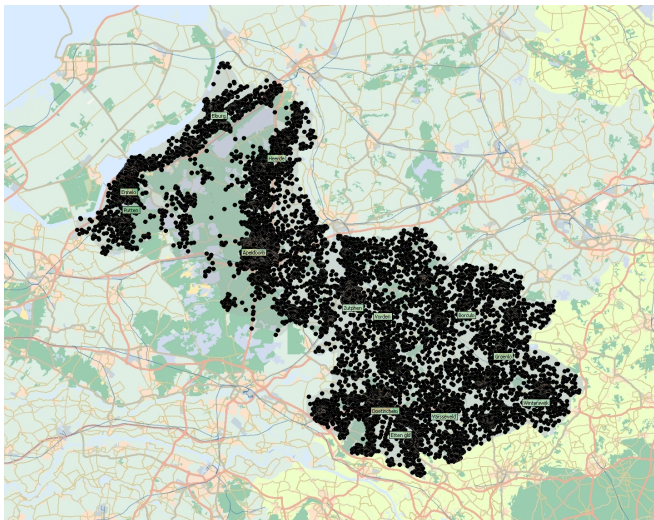
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21 Municipalities, 13 depots

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21 Municipalities, 13 depots, 24167 demand points.

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Let  $r$  be a given time radius.

A demand point is covered by a depot if the driving time from that depot to the demand point is less than  $r$ .

Typical questions:

- Which demand points are covered by at least one depot?
- Which demand points are covered by at least two depots?
- What is the minimum driving time to any demand point?
- What is the route from one location to another?
- How to draw the area covered from any depot?

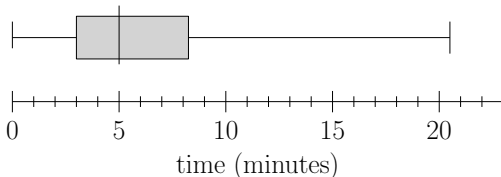
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## Coverage

	#demand points	%
Total	24,167	100.0%
Uncovered	1,160	4.8%
Covered	23,007	95.2%
Double covered	13,999	57.9%

## Driving times



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**Algorithm 1:** DIJKSTRA ( $\mathcal{G} = (\mathcal{V}, \mathcal{A}), s$ )

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```
1:  $d_v \leftarrow \infty \forall v \in \mathcal{V} \setminus \{s\}, d_s \leftarrow 0, Q \leftarrow \{s\}$ 
2: repeat
3:   Select a pivot node  $v \leftarrow \arg \min \{d_v \mid v \in Q\}$ 
4:    $Q \leftarrow Q - \{v\}$ 
5:   foreach  $(v, w) \in \mathcal{A}$  do
6:     if  $d_v + c_{vw} < d_w$  then
7:        $d_w \leftarrow d_v + c_{vw}$ 
8:       if  $w \notin Q$  then
9:          $Q \leftarrow Q \cup \{w\}$ 
10: until  $Q = \emptyset$ 
```

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## Coverage

Determining the coverage of each demand point can be done by growing a partial shortest path tree from each depot. Since  $r$  is usually small, this takes only a small amount of time.

## Driving times

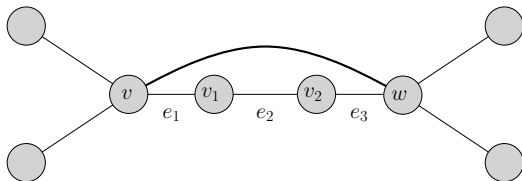
The shortest driving time to each demand point can be calculated by an updated initialization step. All nodes  $v$  that represent a depot are initialized with a zero label  $d_v \leftarrow 0$ . Furthermore, we stop the algorithm as soon as all demand points are chosen as a pivot node.





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## Add shortcuts for 'degree 2 paths'



## Core nodes

A node that is not a 'quarter-node' and not a 'degree 2 node' is a *core node*.

## Partitioning of the node set $\mathcal{V}$

Let  $\mathcal{V}^0 \subset \mathcal{V}$  be the set of core nodes. A partition  $\mathcal{V}^0, \mathcal{V}^1, \dots, \mathcal{V}^K$  of  $\mathcal{V}$  is determined, where  $v, w \in \mathcal{V}^k$  ( $1 \leq k \leq K$ ) if and only if there exists a path from  $v$  to  $w$  that contains only non-core nodes.

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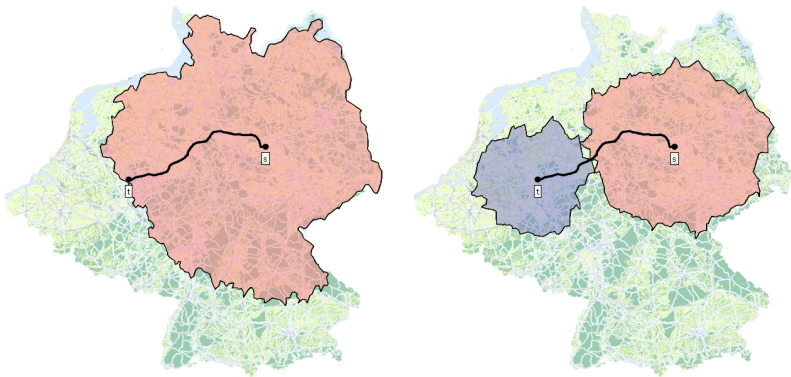
## Roadmap of Germany, The Netherlands, Belgium and Luxembourg

Action	Entity	Amount	%	CPU
Input	$ \mathcal{V} $	8,678,011	100	
Biconnect	Quarter nodes	2,503,779	29	11.8
BypassDegree2	Degree 2 nodes	<u>3,516,724</u>	<u>40</u>	4.1
	Core nodes $\mathcal{V}^0$	<u>2,657,508</u>	31	
Partitioning	Number of subsets	1,672,076		3.8
	$\max_{1 \leq k \leq K}  \mathcal{V}^k $	2,127		

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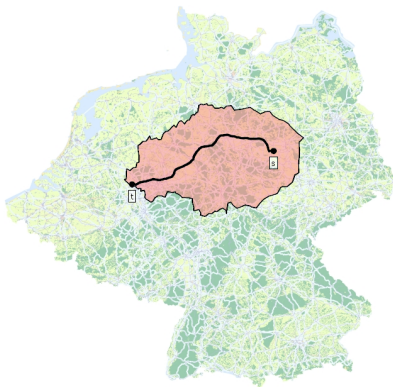
## Bidirectional search



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## Guided search A\*

A heuristic estimator  $h_v$  is provided. The pivot node is now selected according to  $v \leftarrow \arg \min \{d_v + h_v \mid v \in Q\}$ .



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Let  $\delta(v, w)$  be an underestimate for the distance from  $v$  to  $w$ .

## Balanced approach

Forward search uses the estimate  $h_v \leftarrow \frac{1}{2}\delta(v, t) - \frac{1}{2}\delta(s, v)$

Backward search uses the estimate  $h_v \leftarrow \frac{1}{2}\delta(s, v) - \frac{1}{2}\delta(v, t)$

As soon as both searches meet each other, a simple postprocessing step can be used to determine the shortest  $s$ - $t$  distance.

## Symmetric approach

Forward search uses the estimate  $h_v \leftarrow \delta(v, t)$

Backward search uses the estimate  $h_v \leftarrow \delta(s, v)$

A new stop condition is needed to be competitive with the balanced approach.

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## Scalar projections

Let  $\mathbf{x}_v$  be the coordinates of node  $v$ .

$$g_v^s = \frac{(\mathbf{x}_t - \mathbf{x}_s)^\top (\mathbf{x}_{u_0} - \mathbf{x}_v)}{\|\mathbf{x}_t - \mathbf{x}_s\|_2}, \quad v \in \mathcal{V}$$

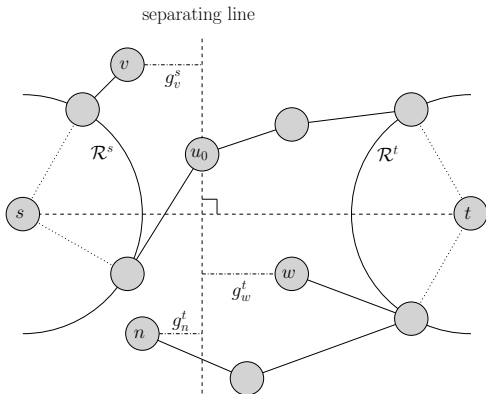
$$g_w^t = \frac{(\mathbf{x}_s - \mathbf{x}_t)^\top (\mathbf{x}_{u_0} - \mathbf{x}_w)}{\|\mathbf{x}_s - \mathbf{x}_t\|_2}, \quad w \in \mathcal{V}$$

## Properties

- $g_v^s + g_w^t = \frac{(\mathbf{x}_t - \mathbf{x}_s)^\top (\mathbf{x}_w - \mathbf{x}_v)}{\|\mathbf{x}_t - \mathbf{x}_s\|_2}$
- $g_v^s + g_w^t \leq \|\mathbf{x}_w - \mathbf{x}_v\|_2$

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We assume  $c_{vw} \geq \alpha \|\mathbf{x}_w - \mathbf{x}_v\|_2$ , for some  $\alpha > 0$ .

As soon as a meeting node  $u_0$  is settled from both sides we reject a new pivot node in the forward search if:

$$d_v^s + \alpha g_v^s \geq d_{u_0}^s$$

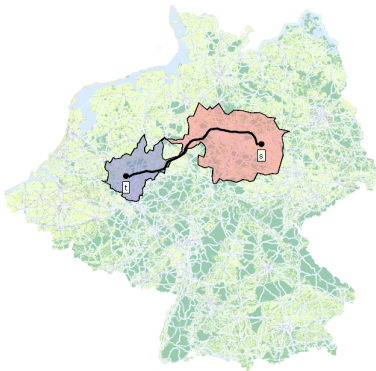
Similarly, a pivot node in the backward search is rejected if:

$$d_v^t + \alpha g_v^t < d_{u_0}^t.$$

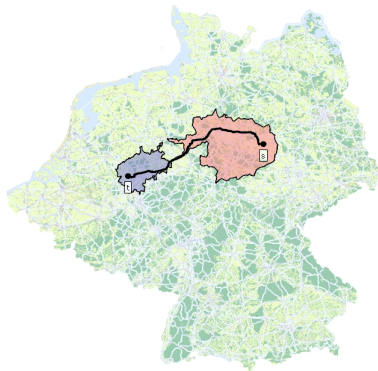
In our thesis, we present a proof that a node on a shortest path will not be rejected from both sides.

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**Balanced**



**Symmetric**



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## Algorithm 2: CONCAVE HULL (ROSÉN ET AL.)

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**Require:** List  $A$  with edges for the convex hull

- 1: Sort list  $A$  on the length of the edges
- 2:  $B \leftarrow \emptyset$
- 3: **while** *list  $A$  not empty* **do**
- 4:     Select the longest edge  $e$  from list  $A$
- 5:     Remove edge  $e$  from list  $A$
- 6:     **if**  *$e$  is suitable to be split in  $e_2$  and  $e_3$*  **then**
- 7:         ┌ Add  $e_2$  and  $e_3$  to list  $A$
- 8:     **else**
- 9:         ┌ Add  $e$  to list  $B$

**Ensure:** List  $B$  contains the edges of a concave hull

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When is it suitable to split an edge  $e$ ?

- It depends on the length of  $e$  (global or local check)
- All points still remain inside the hull
- The hull has to be a simple polygon

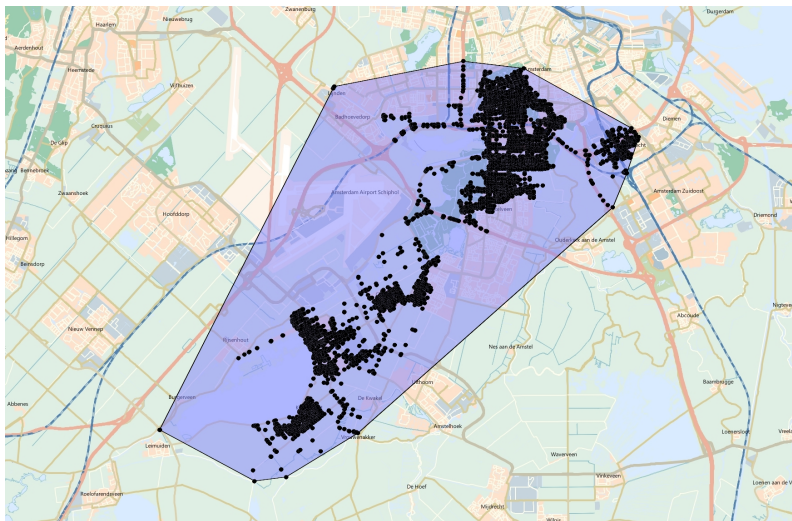
## Implementation

Place all points in a grid. In this way:

- The time needed for determining a new boundary node can be reduced.
- The maximum 'suitable' edge length can be determined locally.

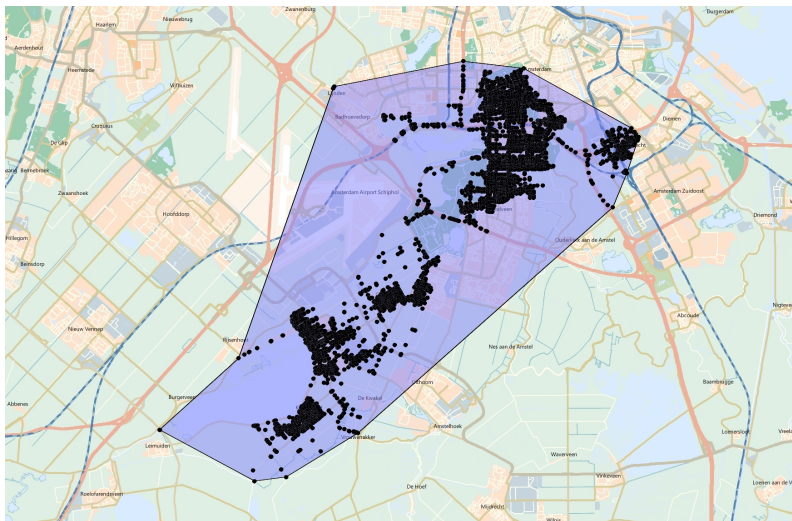
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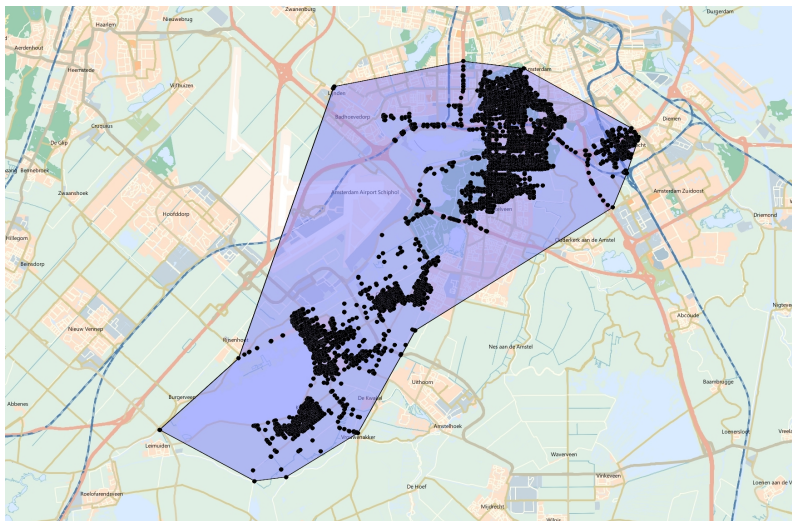
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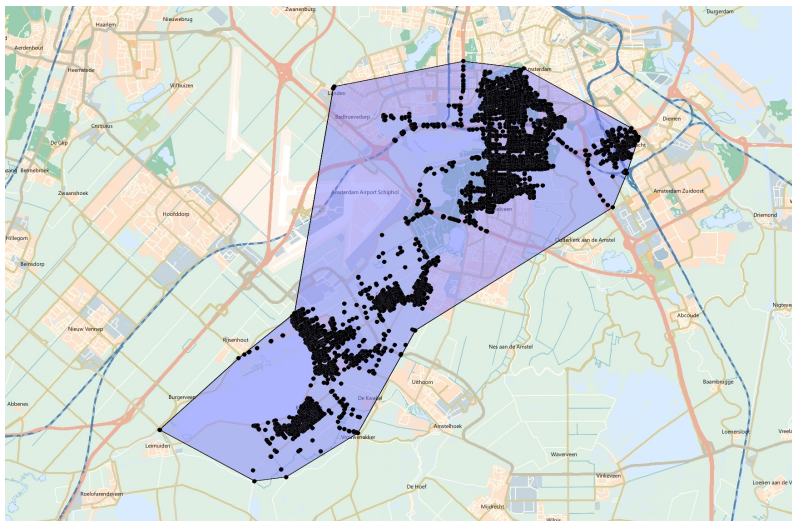
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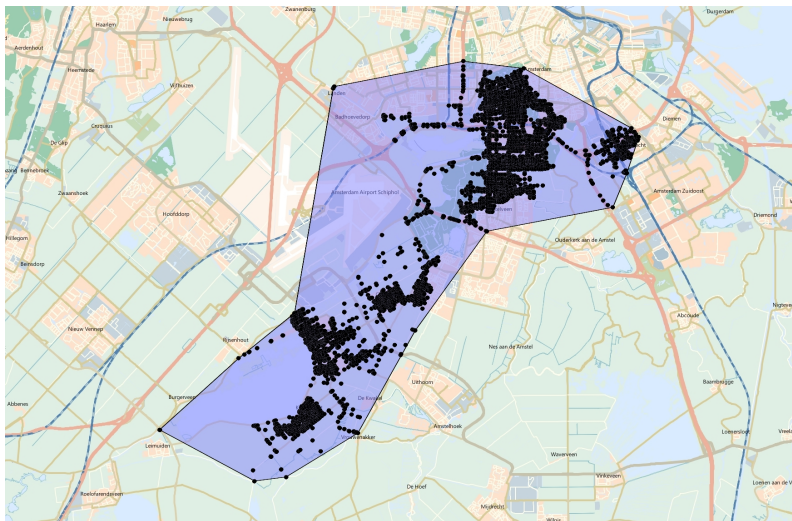
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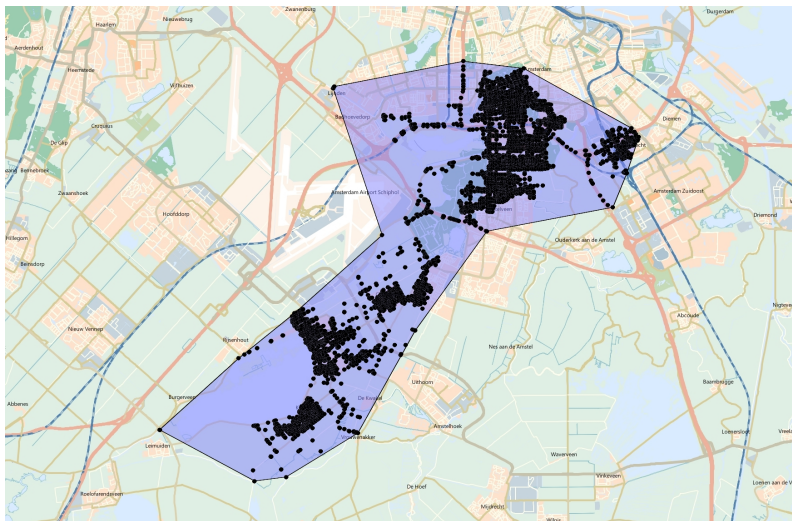
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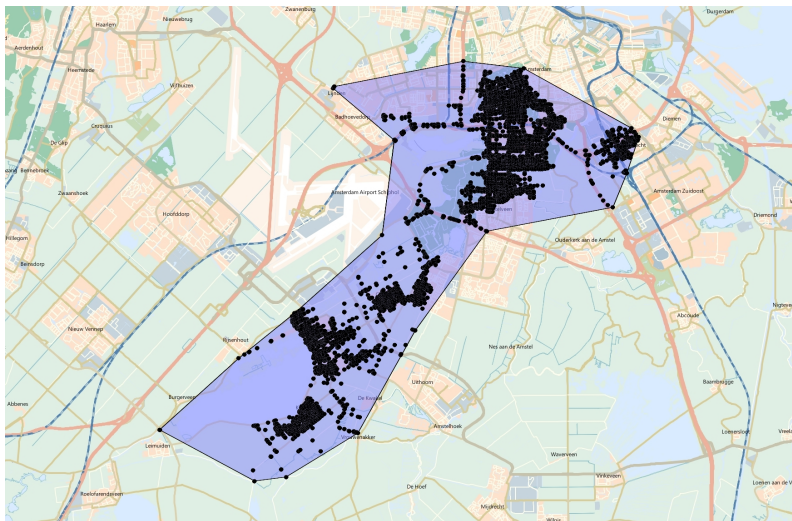
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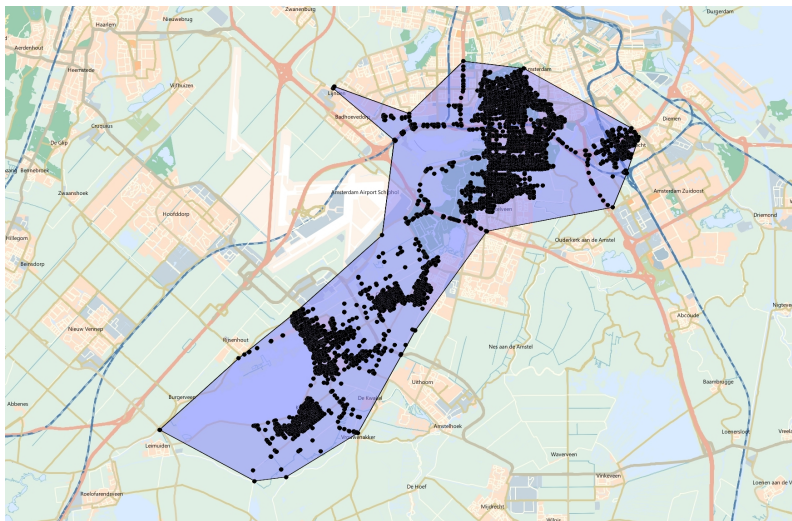
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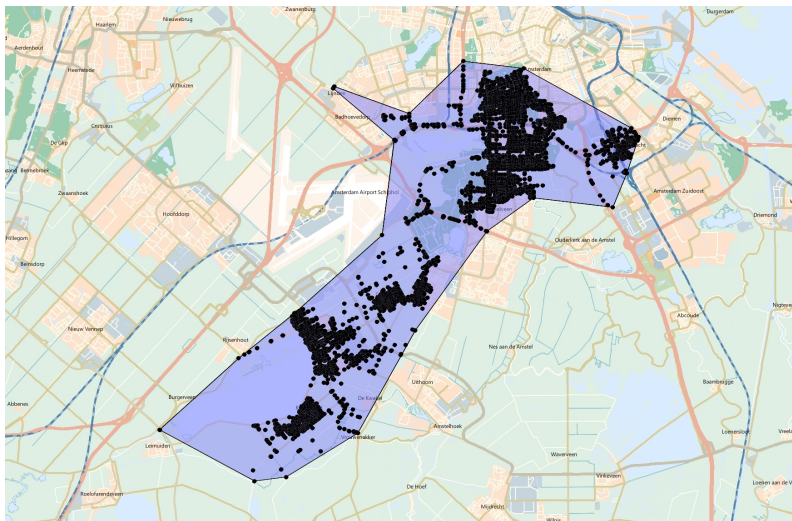
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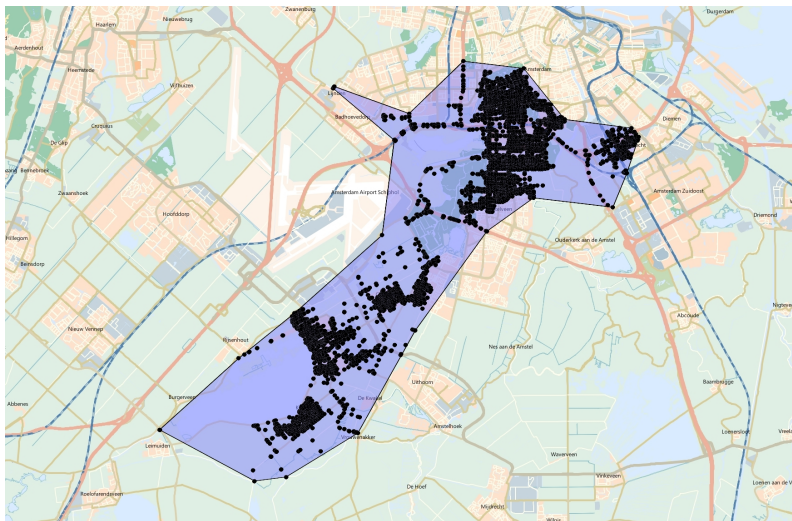
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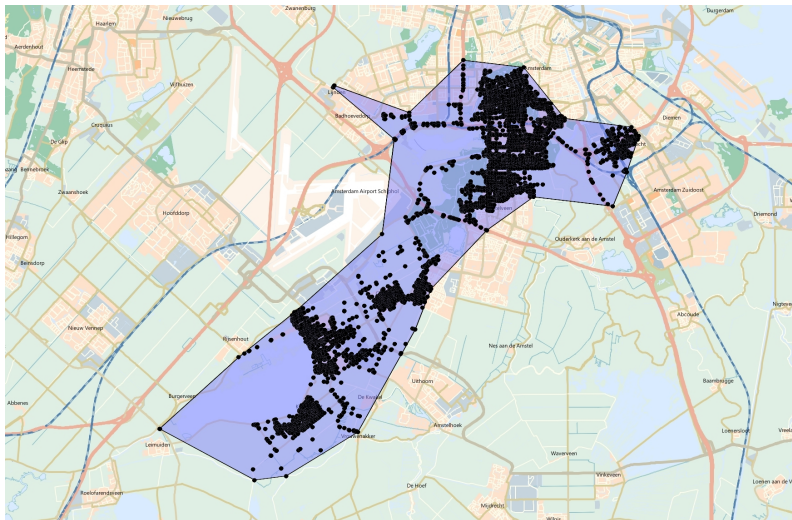
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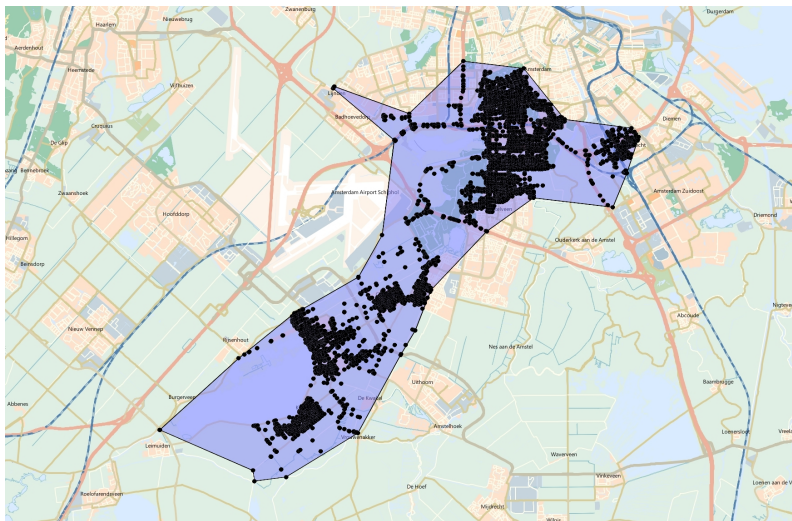
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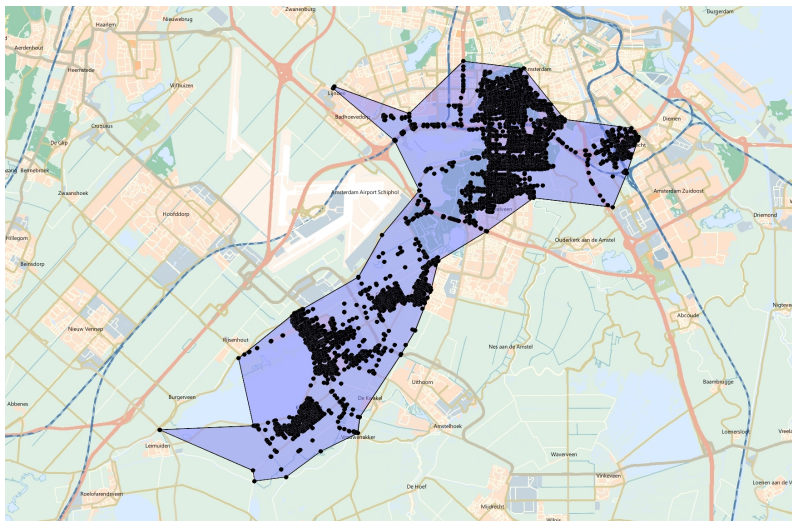
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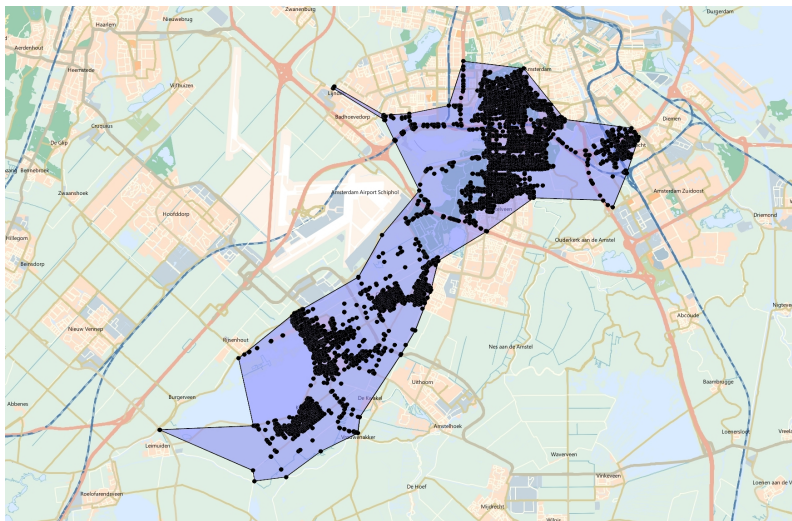
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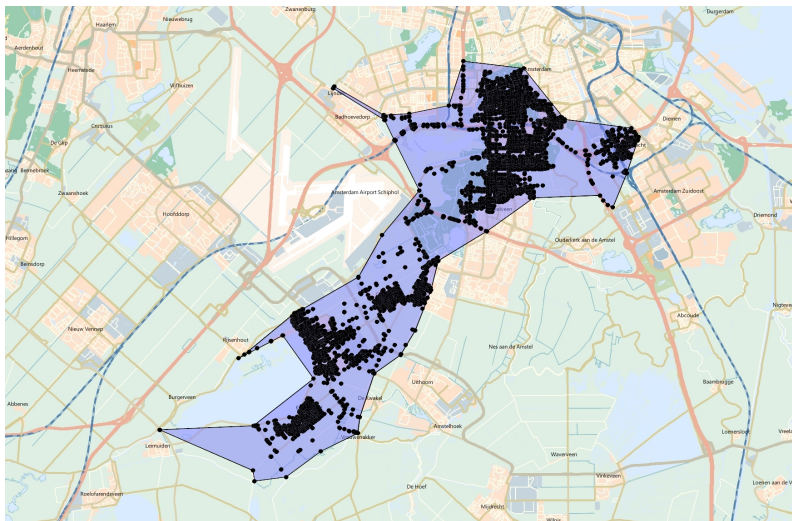
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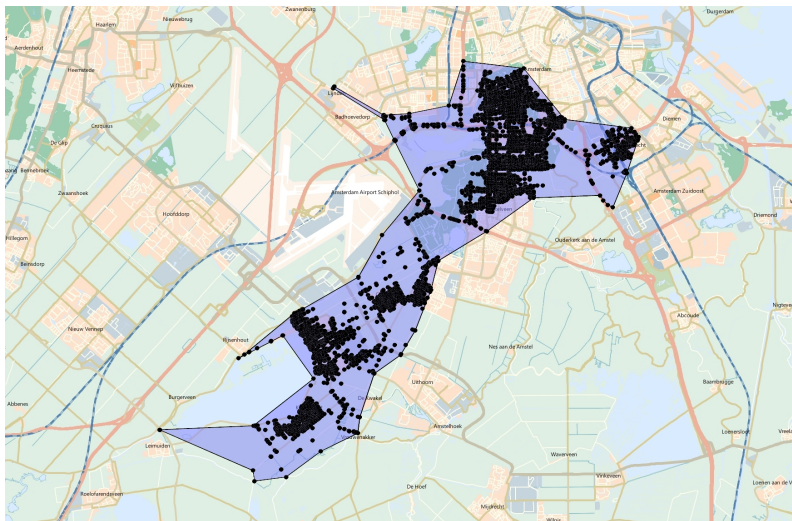
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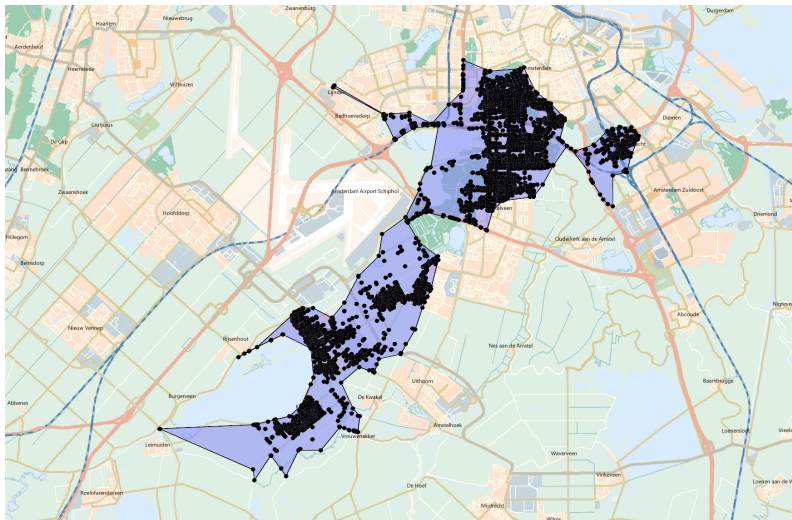
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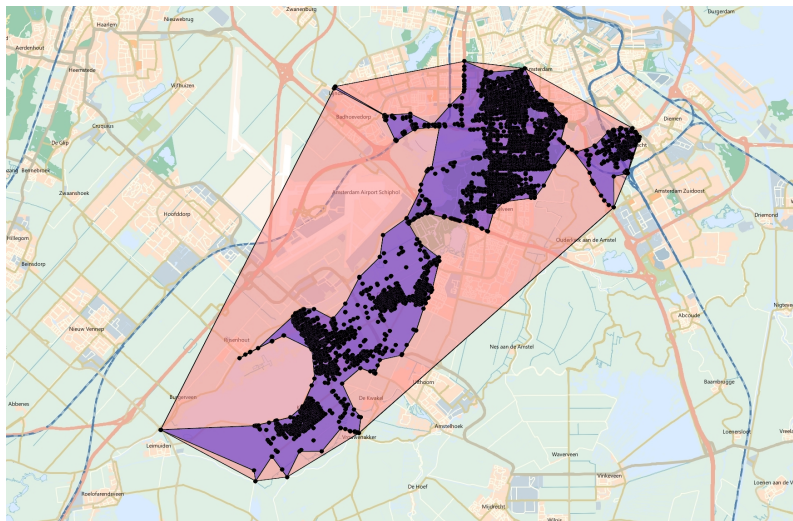
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## Trajectory

A *trajectory* consists of a polyline together with its length and duration. The average speed on a trajectory is considered to be constant.

## Route

A *route* is a sequence of trajectories.

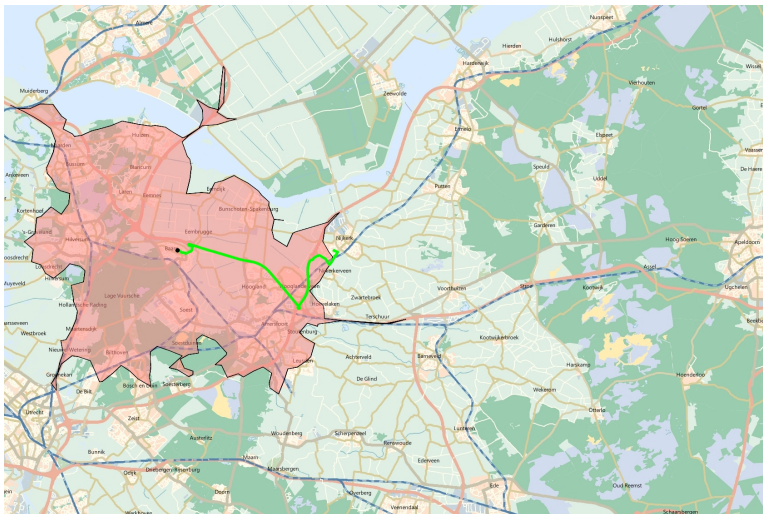
## Usage

If the route of a vehicle is known, the expected position of the vehicle at a certain time  $t$  can be determined.

- This can be used in a real-time environment to determine whether or not certain recalculations are necessary.
- In an off-line environment (e.g. a simulation) one has a more realistic position to determine statistics.

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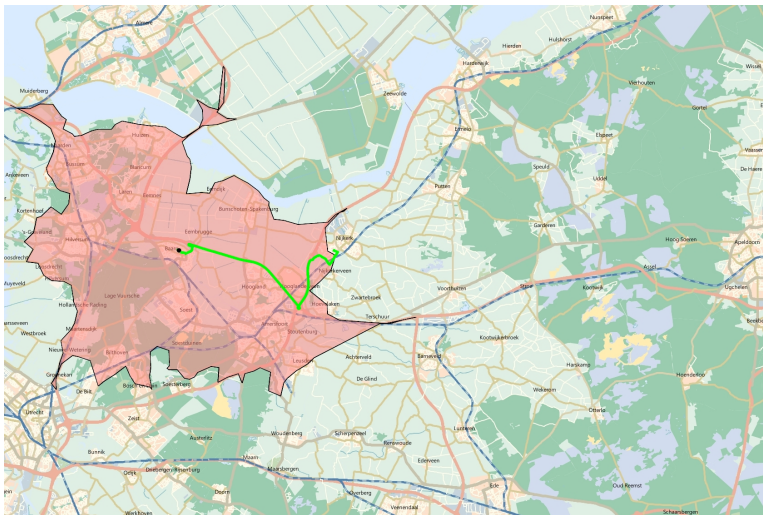
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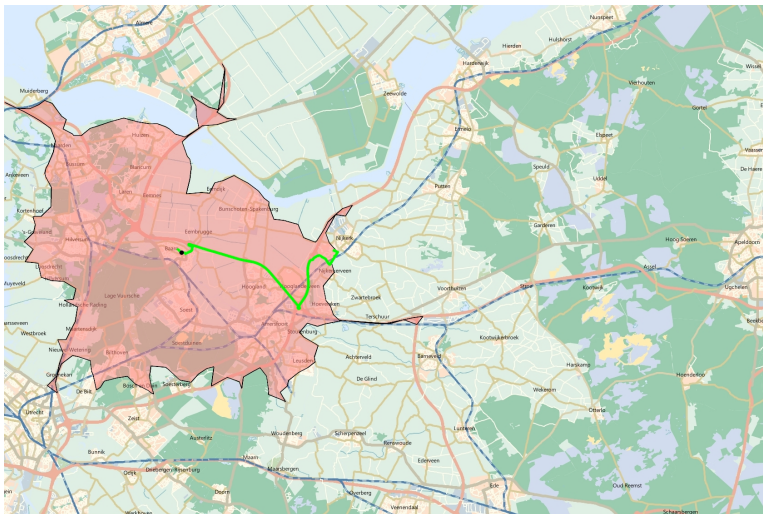
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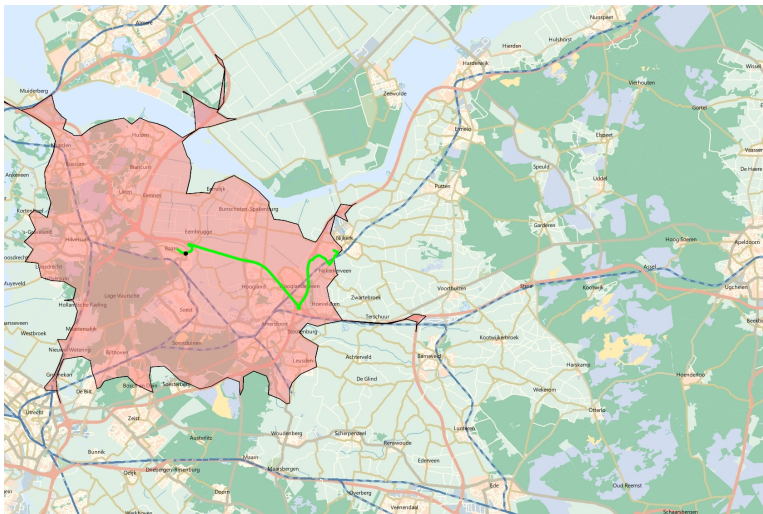
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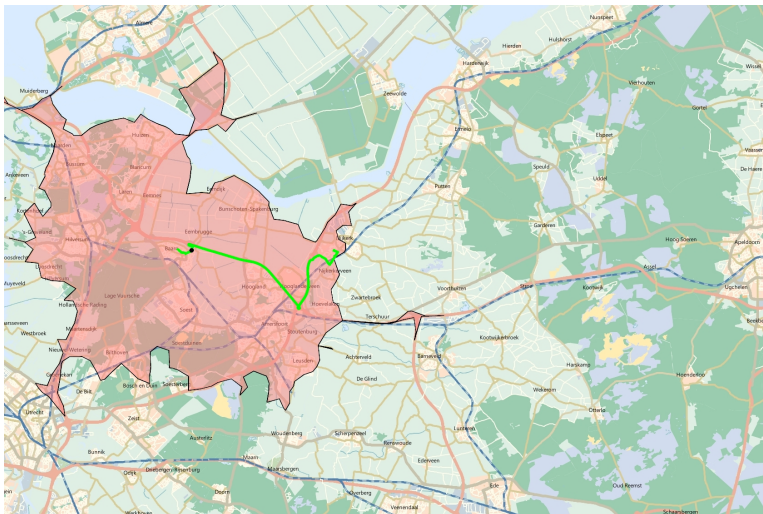
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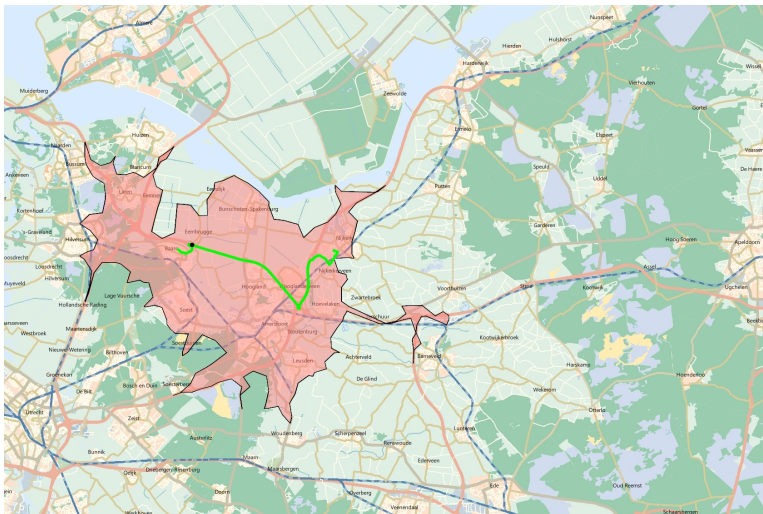
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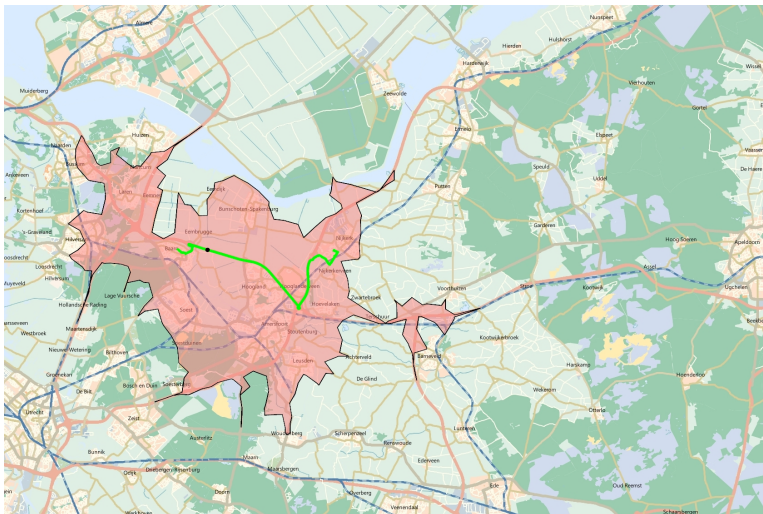
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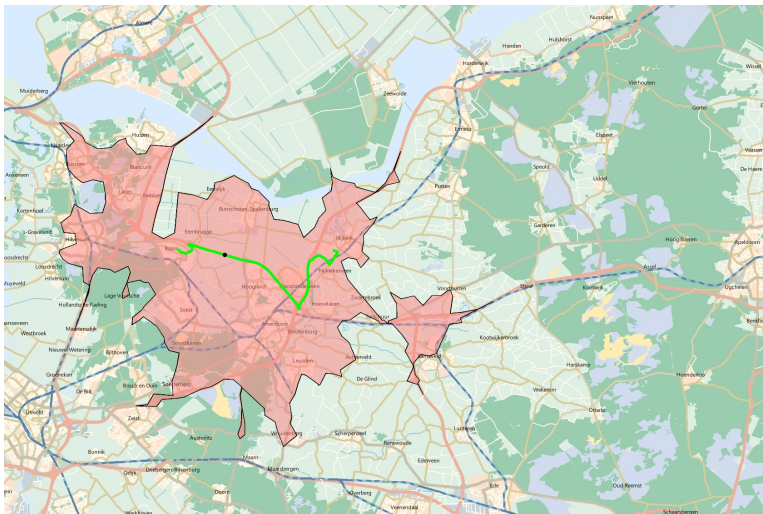
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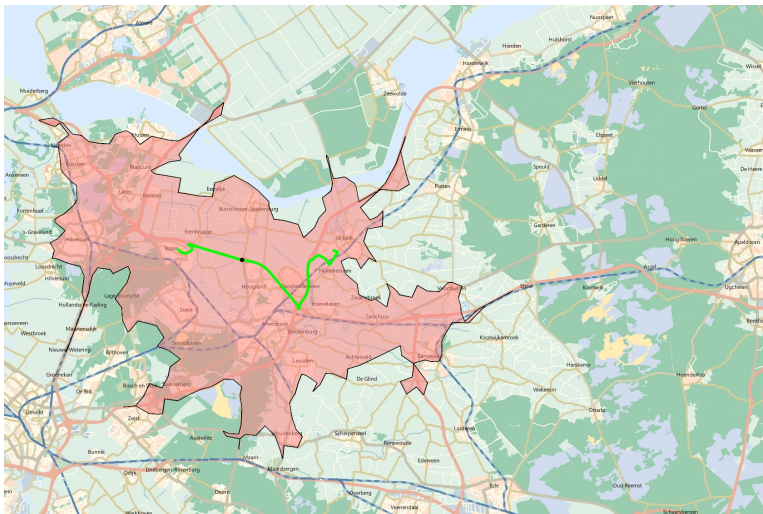
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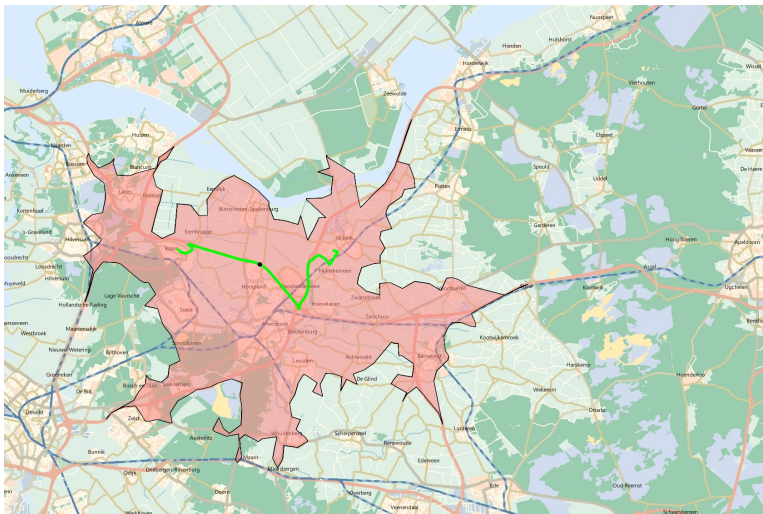
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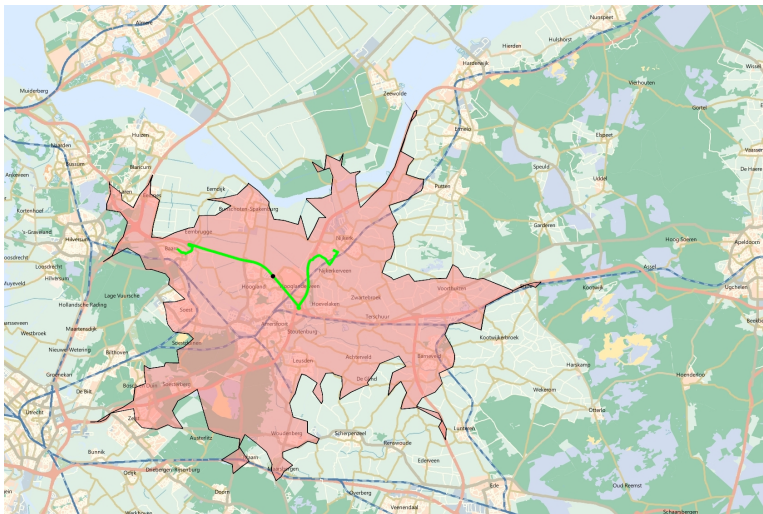
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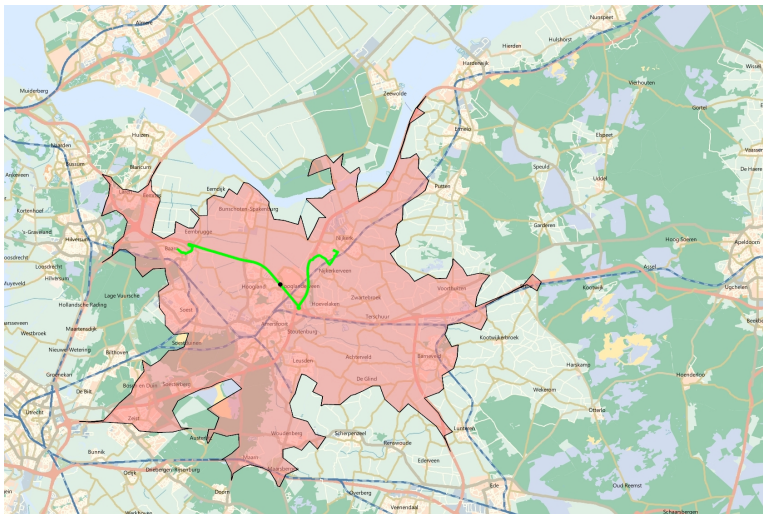
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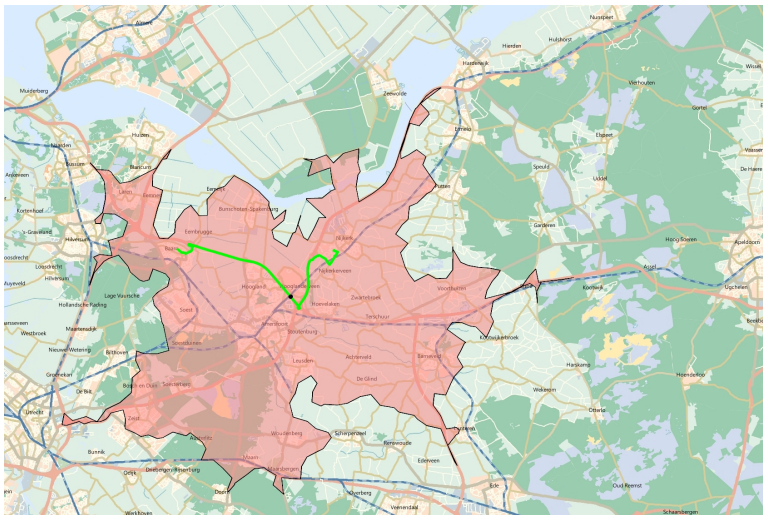
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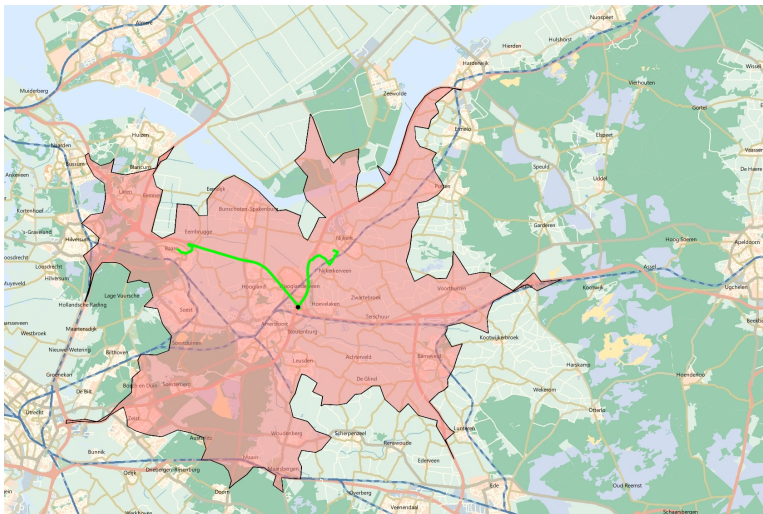
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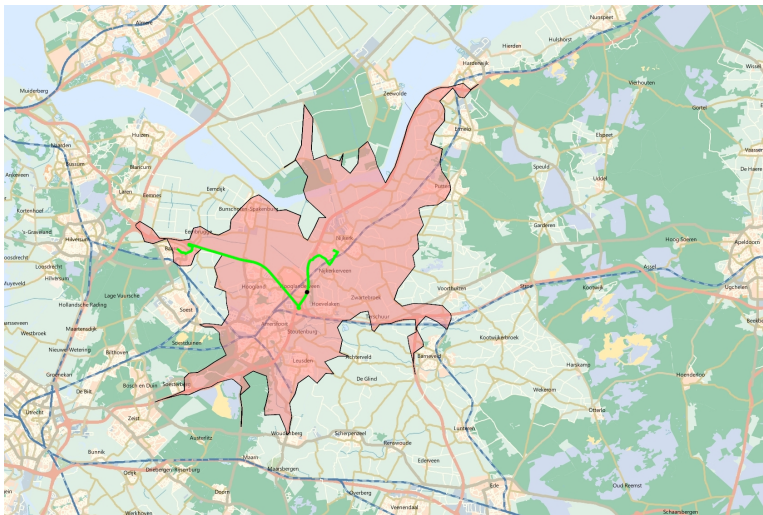
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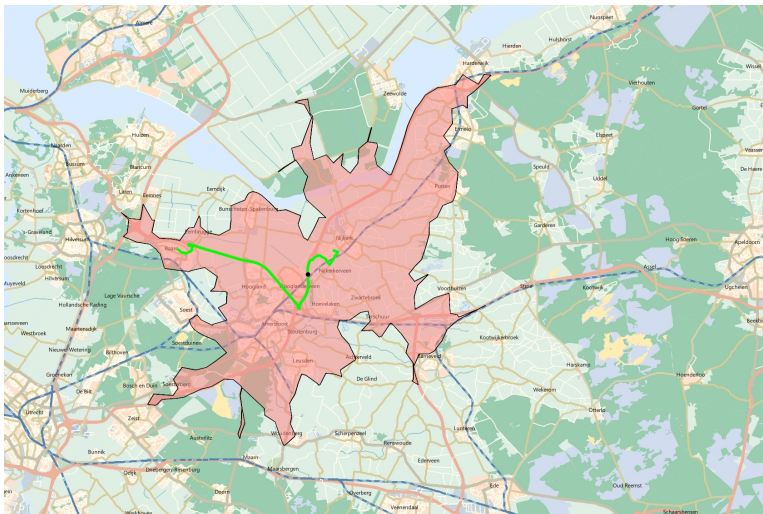
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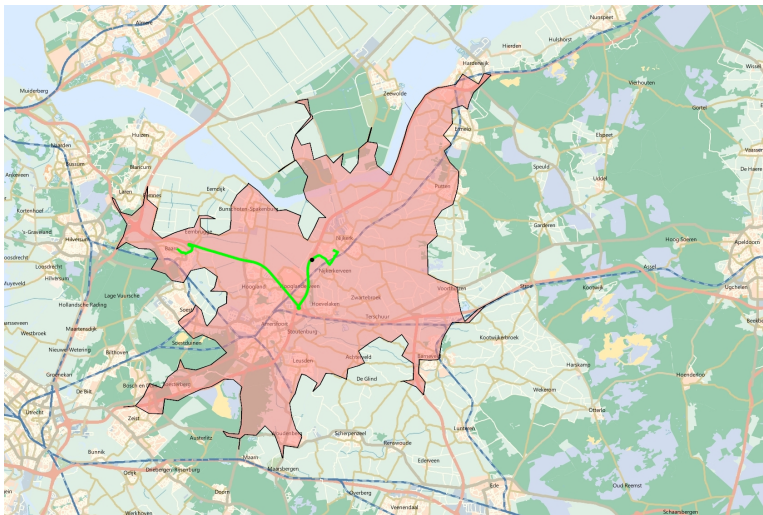
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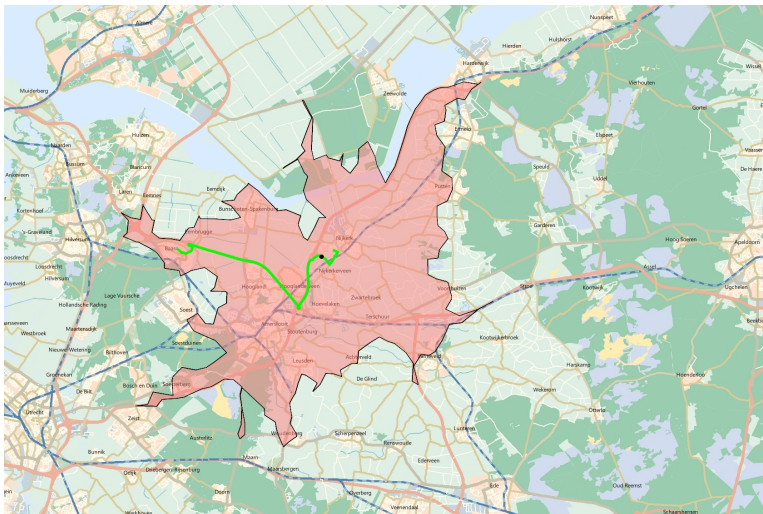
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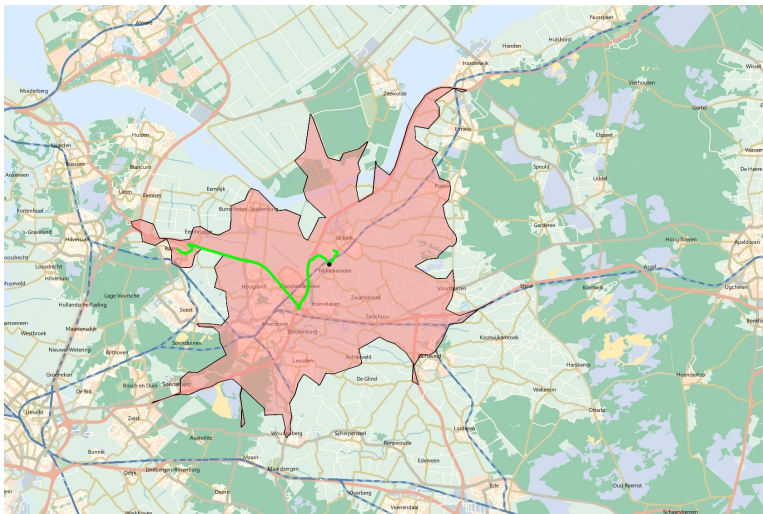
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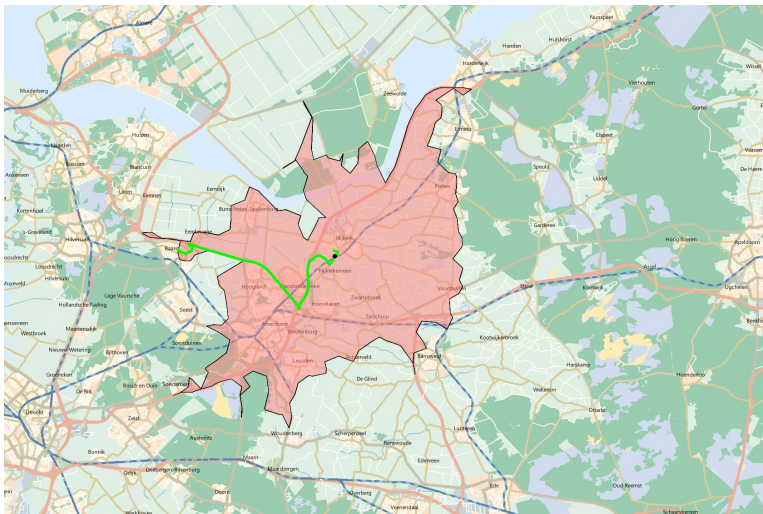
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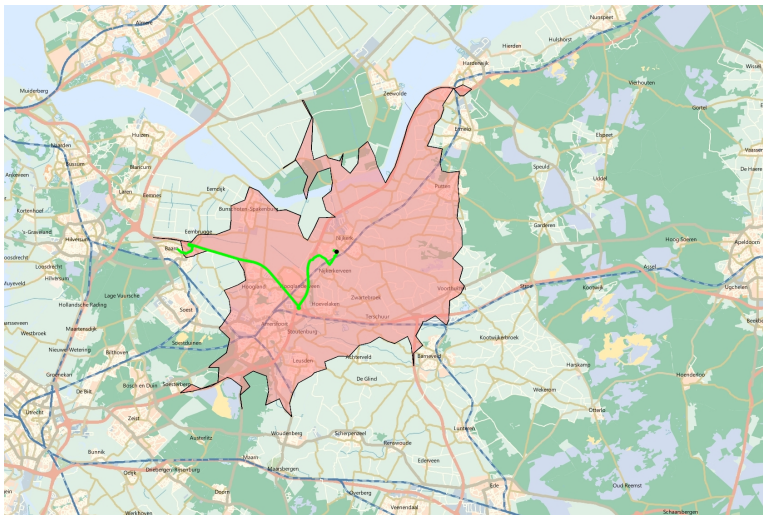
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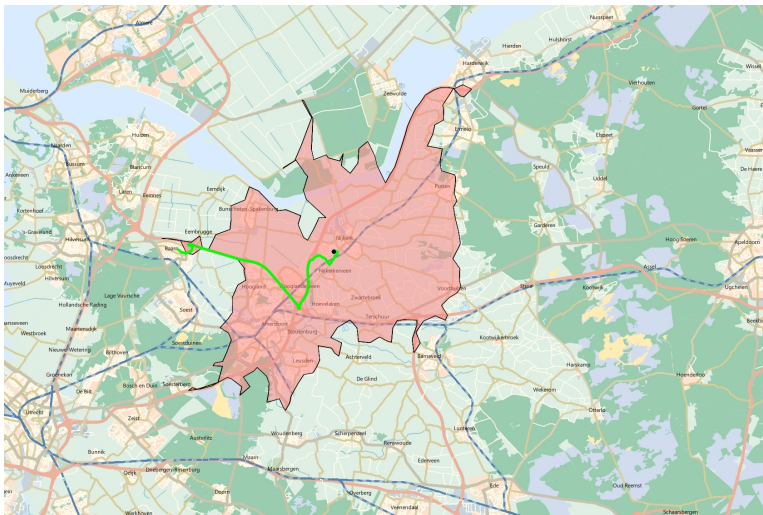
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