

A map of Amsterdam, Netherlands, with various districts highlighted in different colors. The colors include shades of purple, orange, yellow, green, and pink. The map is overlaid with a grid of streets and water bodies. The title text is centered over the map.

Locating the Political Spectrum of Amsterdam

Group 20

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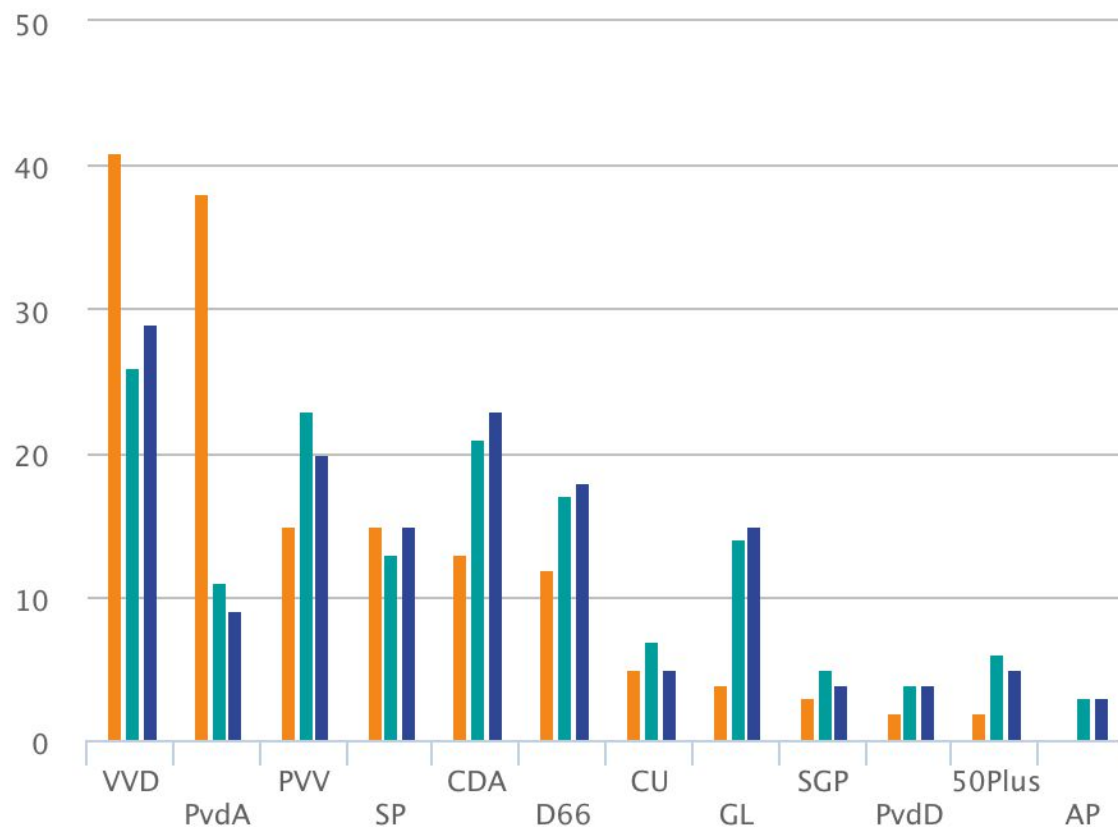
Supervisor: Dr Achilleas Psyllidis

Weert Gilders



ZETELVERDELING

LAATSTE TWEE PEILINGEN



■ Tweede Kamer

■ 9 mrt '17

■ 14 mrt '17



Donald J. Trump ✓

@realDonaldTrump

 **Follow**



"@susanbirchfiel1: Nothing you say will change my mind! Woman for @realDonaldTrump [twitter.com/Carolde/status ...](https://twitter.com/Carolde/status...)"

Carol @Carolde

Dear @CNN @MSNBC @FoxNews #TrumpSupporters are sick of the #Trump bashing RT and or add a comment

RETWEETS

5,759

LIKES

13,813



4:57 AM - 31 Mar 2016

 **2.5K**

 **5.8K**

 **14K**

What do we offer?

- Untapped social media data source
- Localised
- Up to date information
- Aggregate individuals into regions

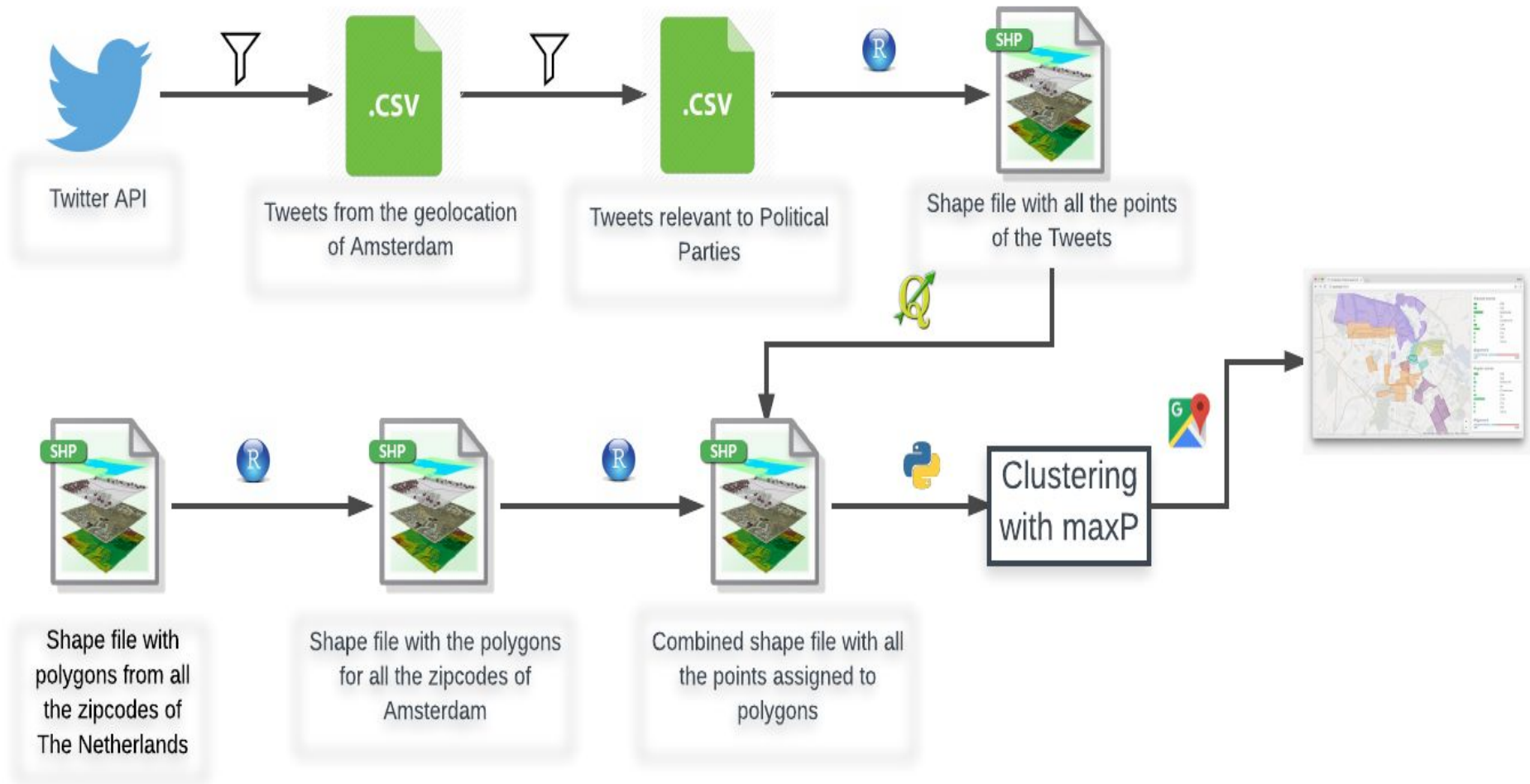


Who is it for?

- Politicians
- Marketing purposes
- Individuals



How does it work?



Twitter Developer Documentation

[Docs](#) / [Streaming APIs](#) / [Reference Documentation](#) / [POST statuses/filter](#)

Products & Services

[Best practices](#)[API overview](#)[Websites](#)[Cards](#)[OAuth](#)[REST APIs](#)[Streaming APIs](#)[Public streams](#)[User Streams](#)

POST statuses/filter

Returns public statuses that match one or more filter predicates. Multiple parameters may be specified which allows most clients to use a single connection to the Streaming API. Both GET and POST requests are supported, but GET requests with too many parameters may cause the request to be rejected for excessive URL length. Use a POST request to avoid long URLs.

The track, follow, and locations fields should be considered to be combined with an OR operator.

`track=foo&follow=1234` returns Tweets matching “foo” OR created by user 1234.

The default access level allows up to 400 track keywords, 5,000 follow userids and 25 0.1-360 degree location boxes. If you need elevated access to the Streaming API, you can [contact Gnip](#).

Resource URL

<https://stream.twitter.com/1.1/statuses/filter.json>

Groenlinks



Jolien van Gaalen 🐰
@jolienvgaalen

Follow

Gearriveerd bij AFAS Live voor de meetup van **#GroenLinks!** **#Klaver** **#stemvoorverandering**

🌐 Translate from Dutch



6:10 PM - 9 Mar 2017



Arrived at AFAS Live for the
meetup of **#GroenLinks!** **#Klaver**
#voteforchange

Techniques

Crawling and Scraping

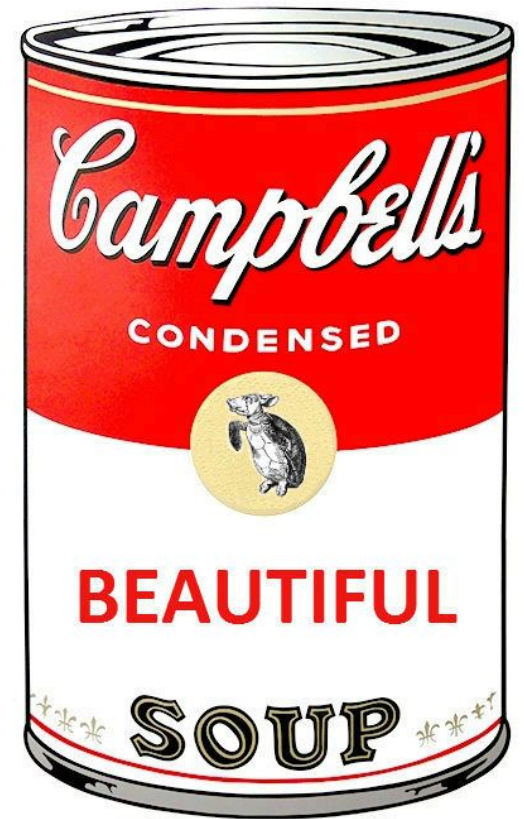
- 10 Domains
- 1000 Pages/Domain
- Tf-idf



PvdA: Progressive, Socialisten

PVV: Nikaab, Sharia

50plus: Pensioen, Ouderen



PvdA?



Fabrice

@Grimlock38

 Follow



On Air 🎧 Progressive Pick 👉

[#asotfestival](#) [#trance](#) [#trancefamily](#)

[#arminvanbuuren](#) [#dj](#) [#artist...](#) [instagram.com/p/BRtgw51ADX1/](https://www.instagram.com/p/BRtgw51ADX1/)

LIKES

2



12:42 PM - 16 Mar 2017 from Amsterdam, The Netherlands



2



Hans U. de Jong

@hansudejong

 Follow



Eindelijk te koop, het eerste duurzaam
geproduceerde commerciële Broodbier in
Nederland @...

[instagram.com/p/BRVpFxoAOQo/](https://www.instagram.com/p/BRVpFxoAOQo/)

 Translate from Dutch

2:13 PM - 7 Mar 2017 from [Waterland, Nederland](#)



Keyword:

Duurzaam

English:

Sustainable

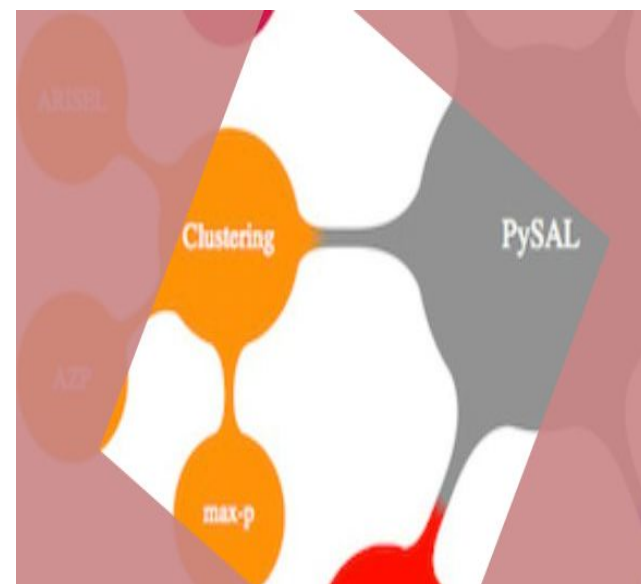
Techniques - Clustering

Regionalization - Spatial clustering

- Goal : Clustering of zipcode areas into larger regions based on their political alignment
- Constraint : Areas being in the same cluster need to be geographical neighbors
- Standard clustering algorithms cannot cope with this constraint
- Regionalization methods are required

Max-p algorithm

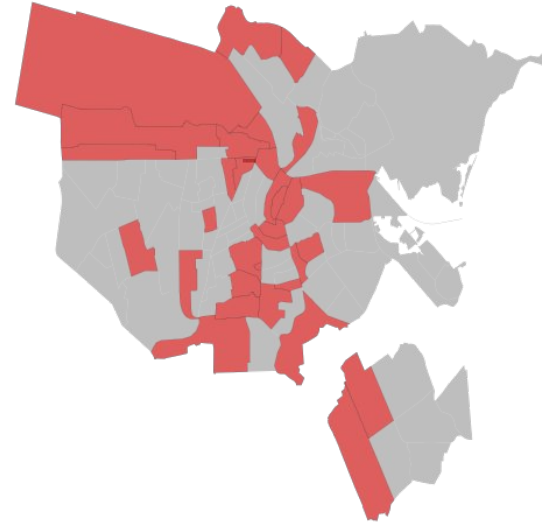
- Number of regions not known beforehand
- Minimum threshold for a specific variable per each region



Techniques - Clustering

Spatial weight matrix

- 3-NN Nearest Neighbors algorithm
- Queen and Rook contiguity approaches lead to islands

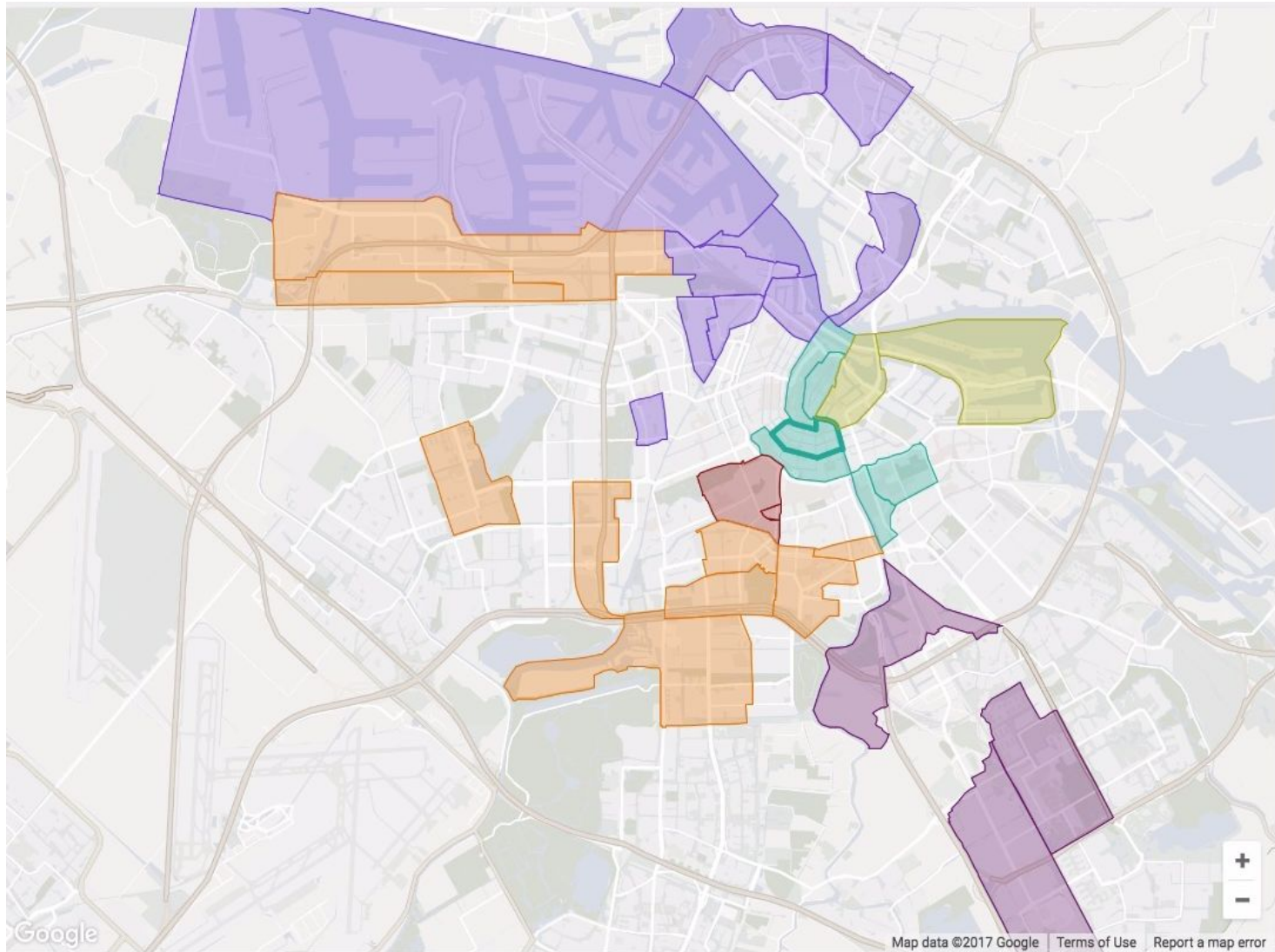


Political alignment attribute

- Weighted sum of the percentage of tweets per party
- Weights represent position of a party in the political spectrum
- Left:0, Centre-left:0.25, Centre:0.5 , Centre-right:0.75, Right:1

Zipcode	VVD	GL	D66	Political Alignment
1013	3	3	4	$(3*0.75+3*0+4*0.5)/10 = 0.425$

Techniques - Clustering



Techniques - Visualisation

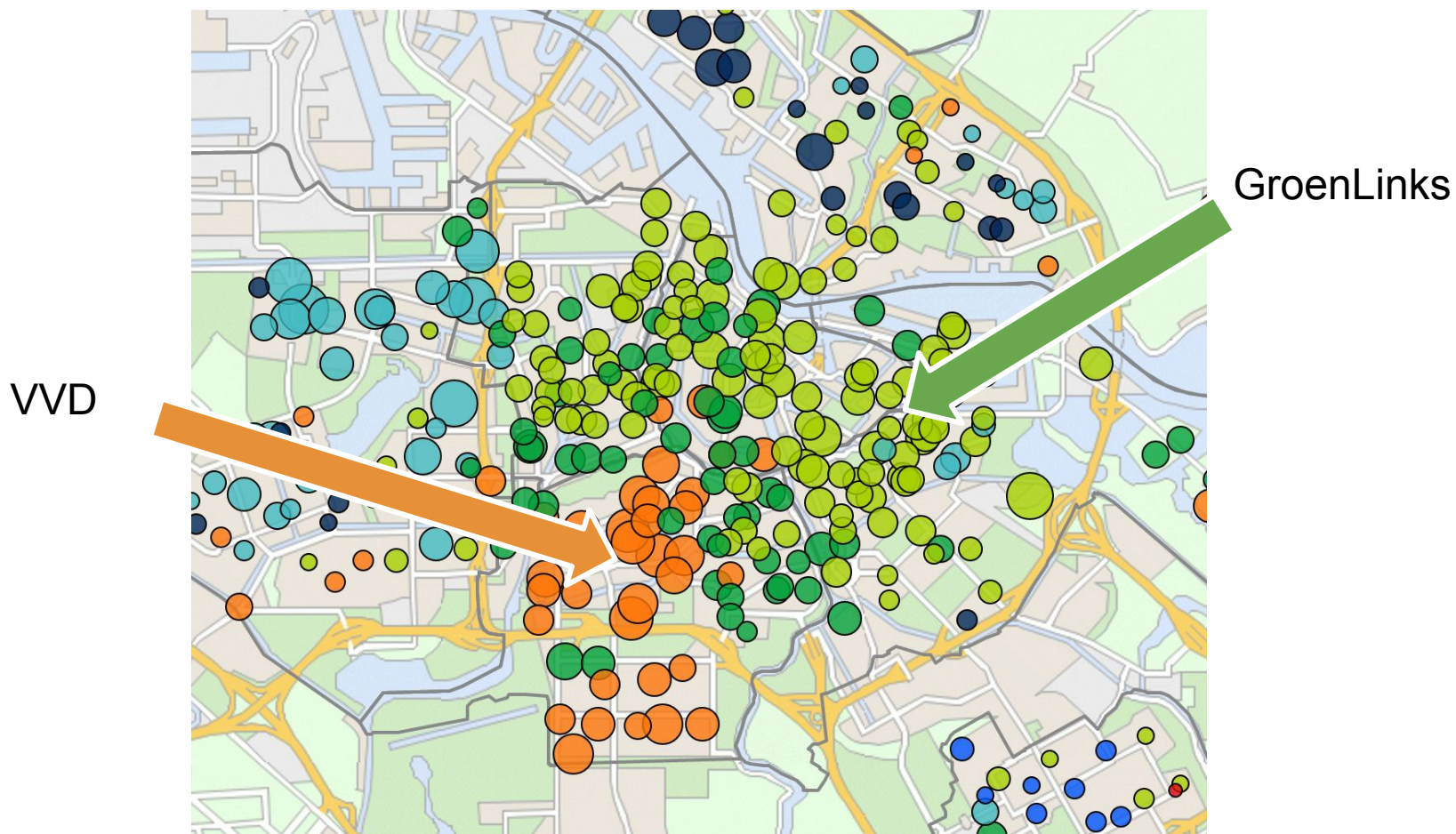
Google maps interactive map



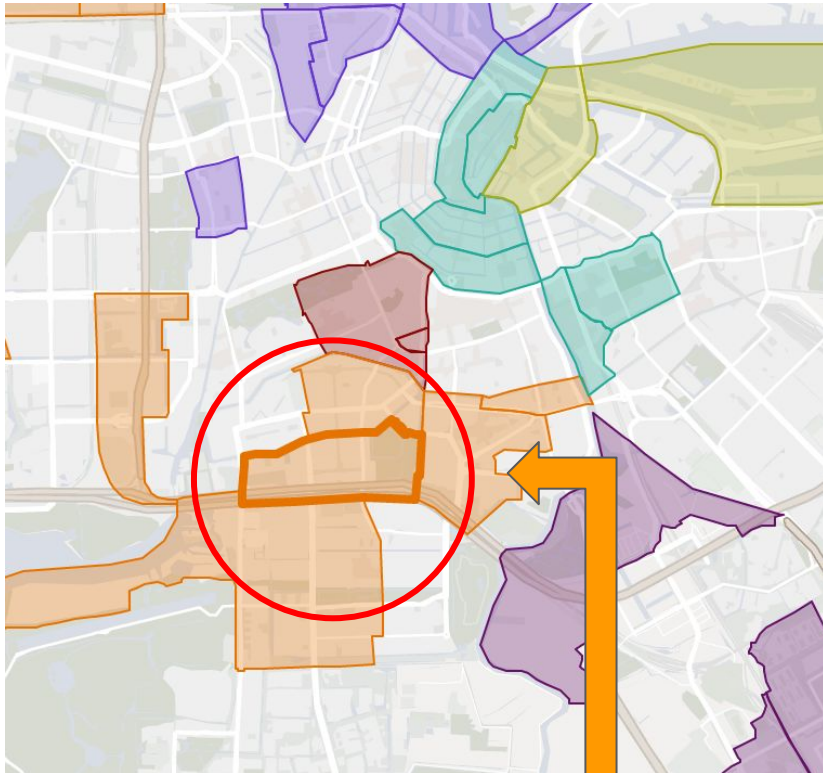
Demo

Evaluation

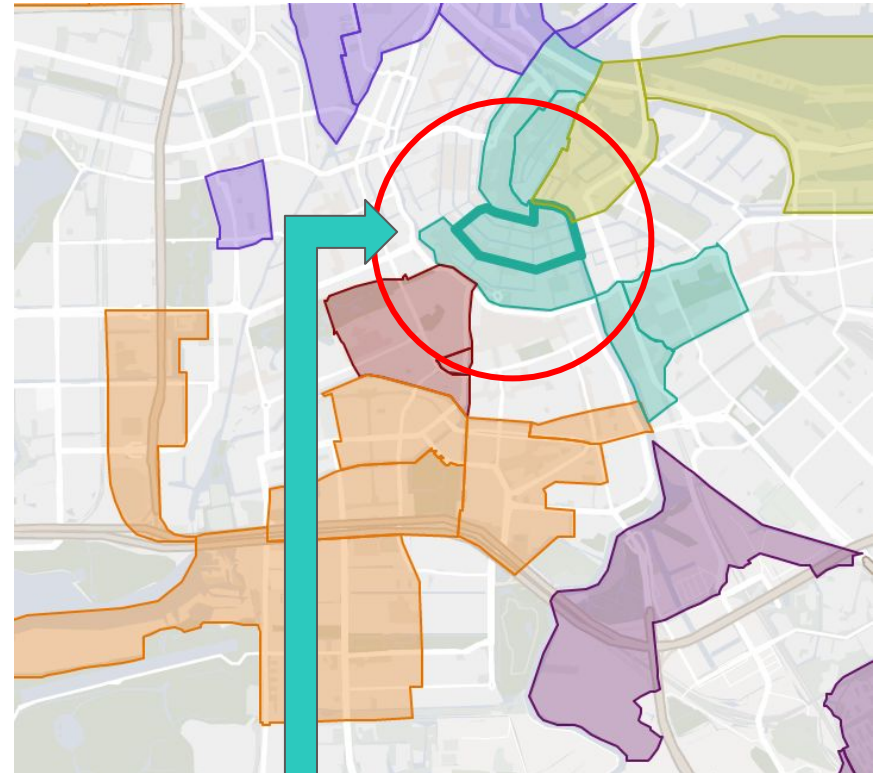
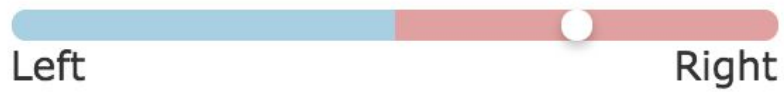
Results per polling station



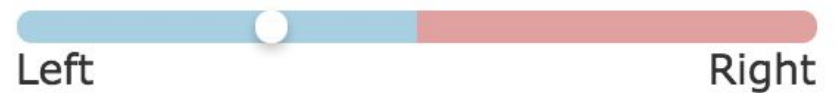
Evaluation



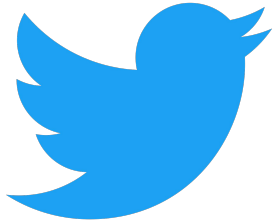
Alignment



Alignment



Recap



Minimize:

$$Z = \left(- \sum_{k=1}^n \sum_{i=1}^n x_i^{k0} \right) * 10^6 + \sum_i \sum_{j|i > i} d_{ij} t_{ij}$$

Subject to:

$$\sum_{i=1}^n x_i^{k0} \leq 1 \quad \forall k = 1, \dots, n$$

$$\sum_{k=1}^n \sum_{c=0}^q x_i^{kc} = 1 \quad \forall i = 1, \dots, n$$

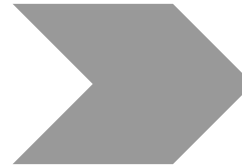
$$x_i^{kc} \leq \sum_{j \in N_i} x_j^{k(c-1)} \quad \forall i = 1, \dots, n; \forall k = 1, \dots, n; \forall c = 1, \dots, q$$

$$\sum_{i=1}^n \sum_{c=0}^q x_i^{kc} l_i \geq threshold * \sum_{i=1}^n x_i^{k0} \quad \forall k = 1, \dots, n$$

$$t_{ij} \geq \sum_{c=0}^q x_i^{kc} + \sum_{c=0}^q x_j^{kc} - 1 \quad \forall i, j = 1, \dots, n; |i| < |j|; \forall k = 1, \dots, n$$

$$x_i^{kc} \in \{0, 1\} \quad \forall i = 1, \dots, n; \forall k = 1, \dots, n; \forall c = 0, \dots, q$$

$$t_{ij} \in \{0, 1\} \quad \forall i, j = 1, \dots, n; |i| < |j|$$



References

1. Duque, J. C., Anselin, L., & Rey, S. J. (2012). The max-p-regions problem. *Journal of Regional Science*, 52(3), 397-419.
2. Rey, S.J. & Anselin, L. (2010) PySAL: a python library of spatial analytical methods. *Handbook of Applied Spatial Analysis: Software Tools, Methods and Applications* (eds M.Fischer & A.Getis), pp. 175–193. Springer, Berlin.