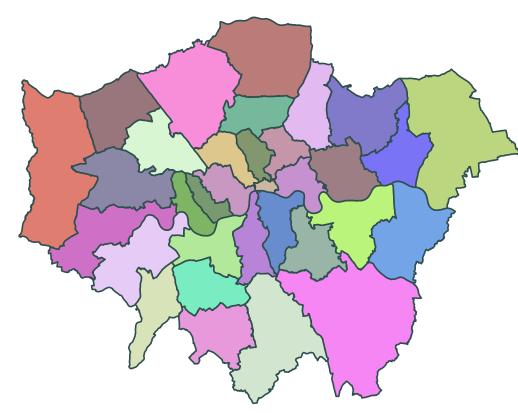
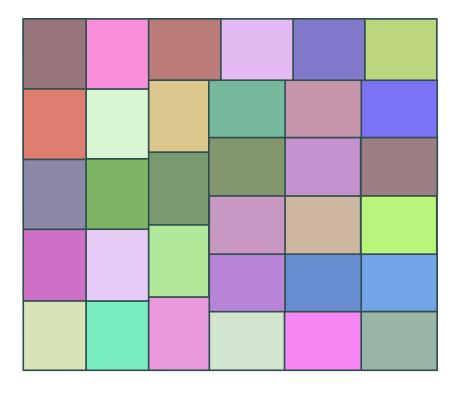


University of California, Irvine, Utrecht University, TU Eindhoven



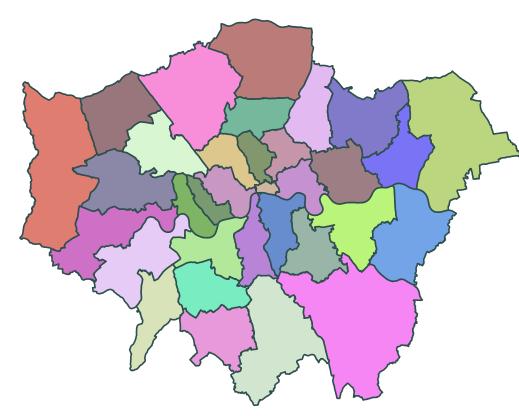
Given a map with *n* regions we want to visualise some data for each region.

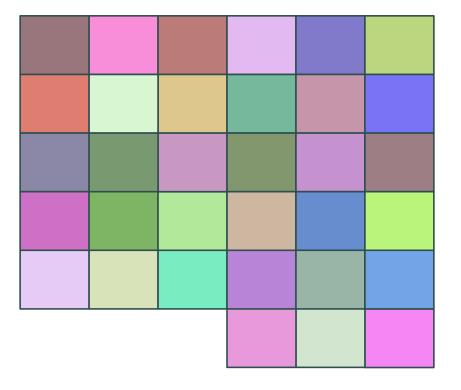




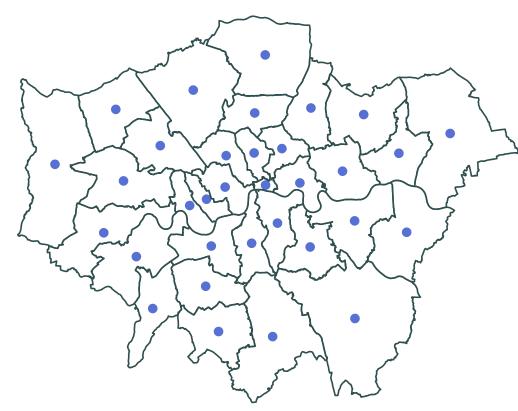
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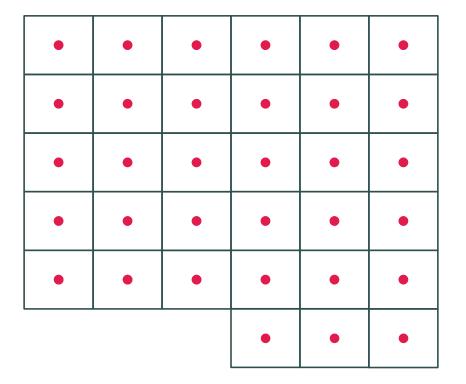
Options: Symbol map, Cartogram, Spatial Treemap (Wood and Dykes 2008)



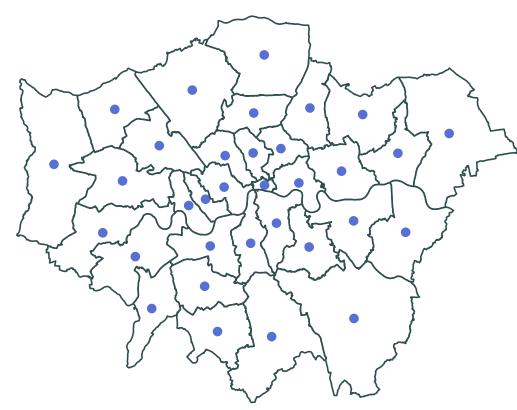


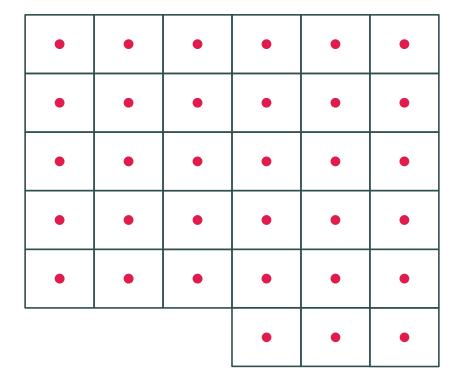
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One-to-one Point Set Matching Problem Represent the regions by a set *A* blue points. Represent the grid by a set *B* blue points.

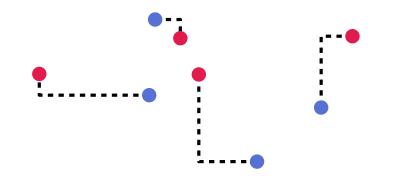




One-to-one Point Set Matching Problem Represent the regions by a set A blue points. Represent the grid by a set B blue points. **Goal:** find the best matching $\phi : A \rightarrow B$ Optimisation Criteria

What is the "best" matching?

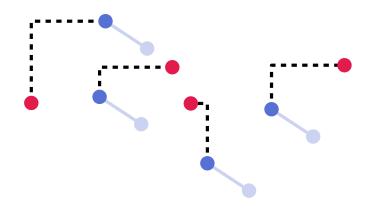
• Minimise the total L_1 distance.



Optimisation Criteria

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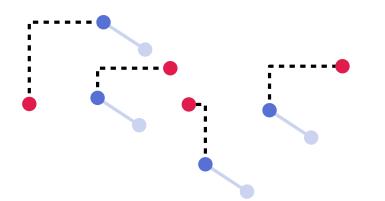
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Optimisation Criteria

What is the "best" matching?

• Minimise the total L_1 distance.



• Maximise the number of pairs with the correct directional relation.



Minimising L_1 -distance

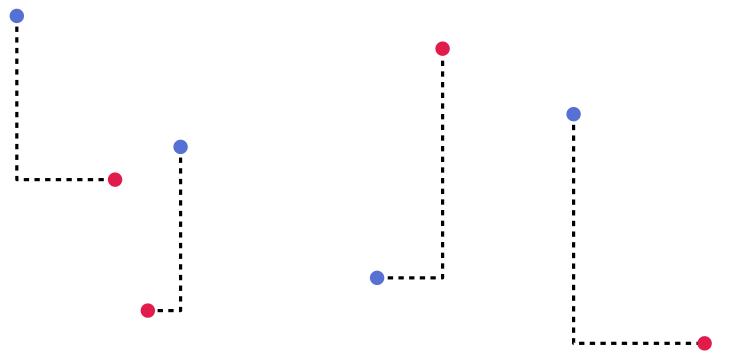
We want to find a matching ϕ^* , translation t^* , and scaling λ^* that minimise

$$D(\phi, t, \lambda) = \sum_{a \in A} d(\lambda a + t, \phi(a)).$$

Minimising L_1 -distance

We want to find a matching ϕ^* and translation t^* that minimise

$$D_{\mathcal{T}}(\phi, t) = \sum_{a \in A} d(a + t, \phi(a)).$$



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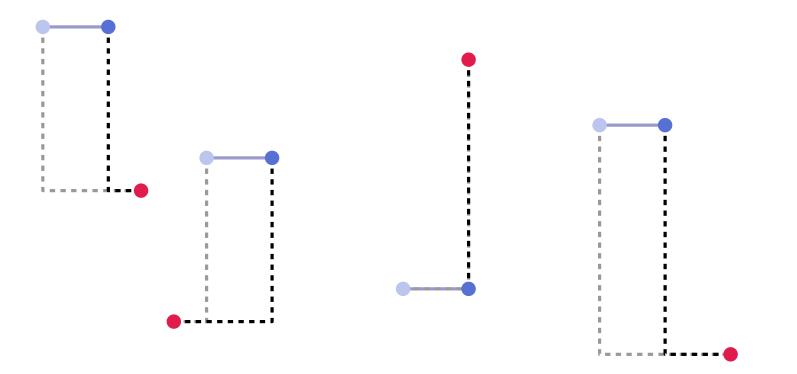
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Aligning A and B decreases D_T



Lemma 1. For any matching ϕ , there is a t that x-aligns A and B and minimises $D_{\mathcal{T}}(\phi, \cdot)$.

Minimising D_T

There is an optimal matching at an *x*-alignment. Same trick for *y*-alignment. Minimising $D_{\mathcal{T}}$

There is an optimal matching at an x-alignment.Same trick for y-alignment.There is an optimal matching at an x- and y-alignment.

 \implies There are at most n^4 such alignments.

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Theorem 1. A ϕ^* and t^* that minimise D_T can be computed in $O(n^4 \cdot n^2 \log^3 n) = O(n^6 \log^3 n)$ time.

Uses the matching algorithm by Vaidya (1988)

Minimum distance matching under scaling?

Use exactly the same approach.

Minimum distance matching under scaling? Use exactly the same approach.

Minimum distance matching under translation and scaling?

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Same idea: x-align (y-align) two pairs of points.

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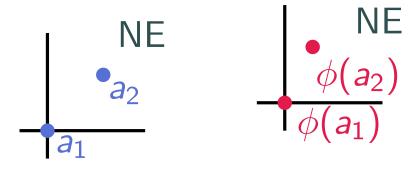
Same idea: x-align (y-align) two pairs of points.

Theorem 2. $A \phi^*$, t^* , and λ^* that minimise D can be computed in $O(n^8 \cdot n^2 \log^3 n) = O(n^{10} \log^3 n)$ time.

Preserving directional relations



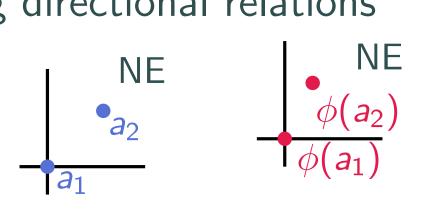
Preserving directional relations



Minimising the number of out-of-order pairs

$$W(\phi) = |\{(a_1, a_2) \mid (a_1, a_2) \in A \times A \land dir(a_1, a_2) \neq dir(\phi(a_1), \phi(a_2))\}|.$$

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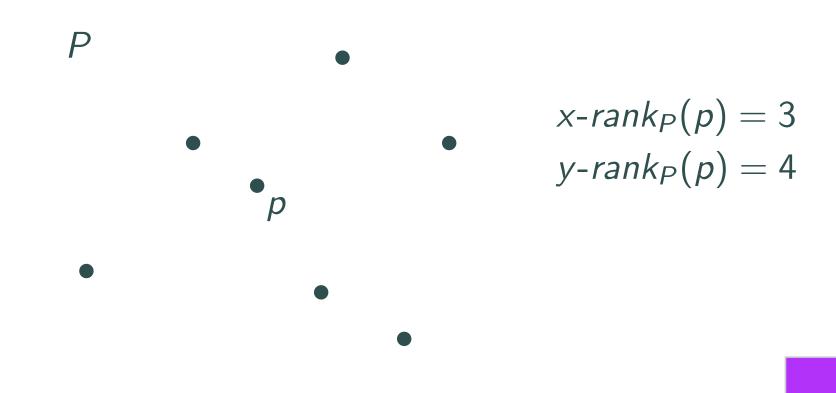
Translation and scaling do not influence W.

Compute a minimum distance matching with distance measure

$$w(a, b) = |x - rank_A(a) - x - rank_B(b)| + |y - rank_A(a) - y - rank_B(b)|.$$

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w(a, b) is the L_1 -distance in terms of ranks.

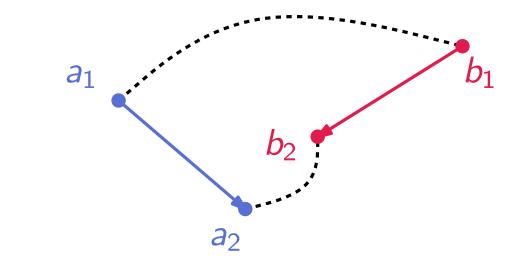
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w(a, b) is the L₁-distance in terms of ranks.
So compute an optimal matching using Vaidya's Algorithm.

Theorem 3. A 4-approximation for minimising W can be computed in $O(n^2 \log^3 n)$.

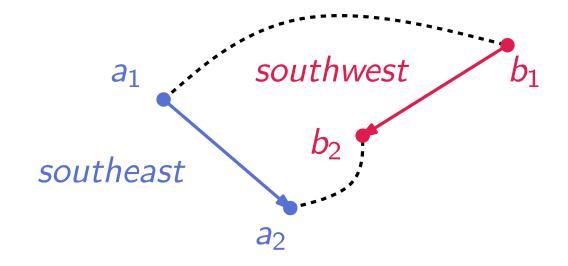
Inversions vs Directions



x- $rank_A(a_1) < x$ - $rank_A(a_2)$ and x- $rank_B(b_1) > x$ - $rank_B(b_2)$

 (a_1, a_2) is an inversion.

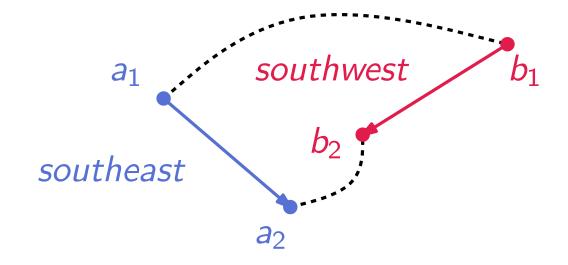
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 (a_1, a_2) is an inversion. (a_1, a_2) is an out-of-order pair So $W(\phi) = \#$ inversions $= I(\phi)$.

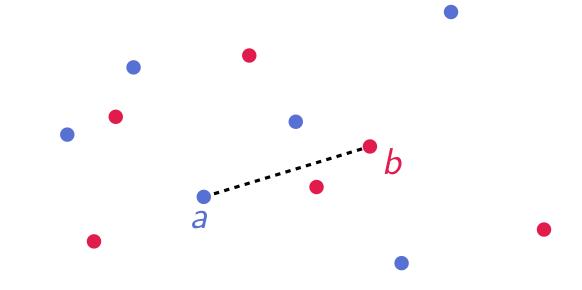
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Lemma 3. $I_{y}(\phi) \leq Y(\phi) \leq 2I_{y}(\phi)$.

This leads to a 4-approximation algorithm.

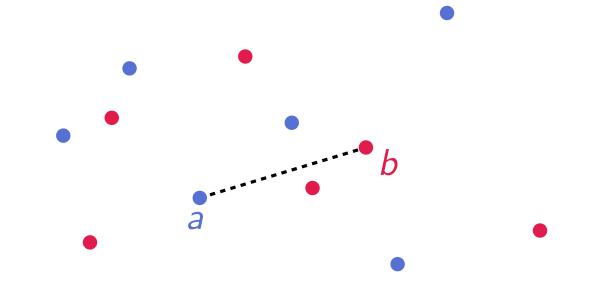
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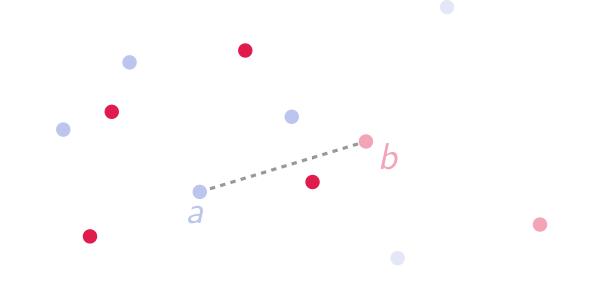


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The matching has at least j - i x-inversions.

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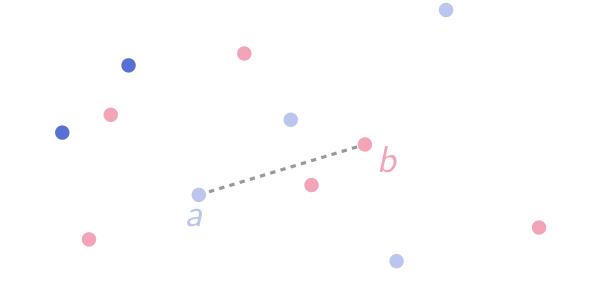


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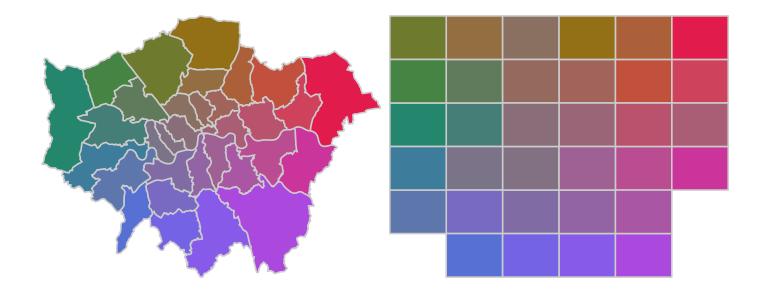
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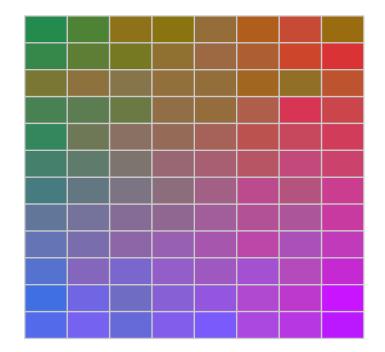
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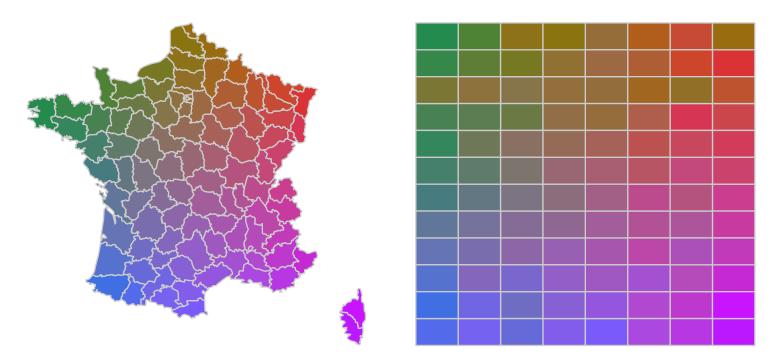
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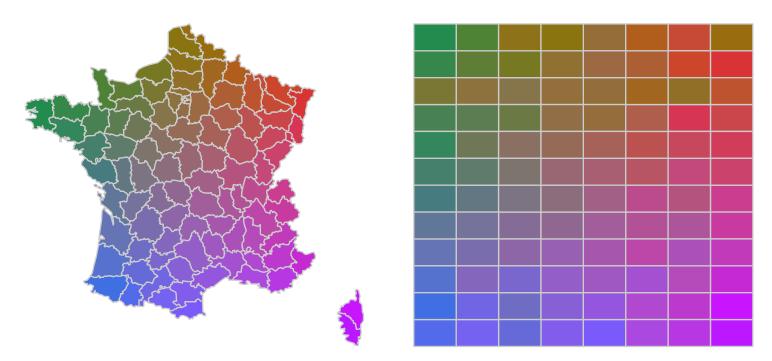






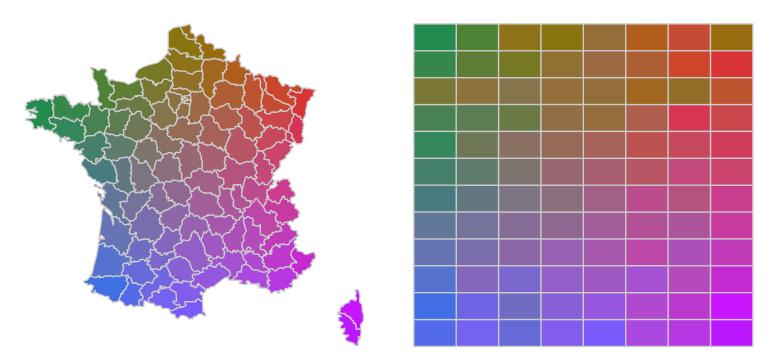


• Faster algorithm to minimise D_T , D_Λ , and D?



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- Exact or algorithm to preserve directional relations?

 $(1 + \epsilon)$ approximation?



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Thank you!