

Approximate Minimum-Weight Partial Matching under Translation

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Wolfgang Mulzer³ Günter Rote³ Micha Sharir² Allen Xiao¹

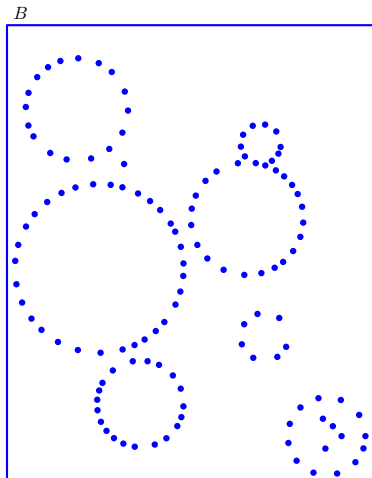
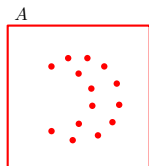
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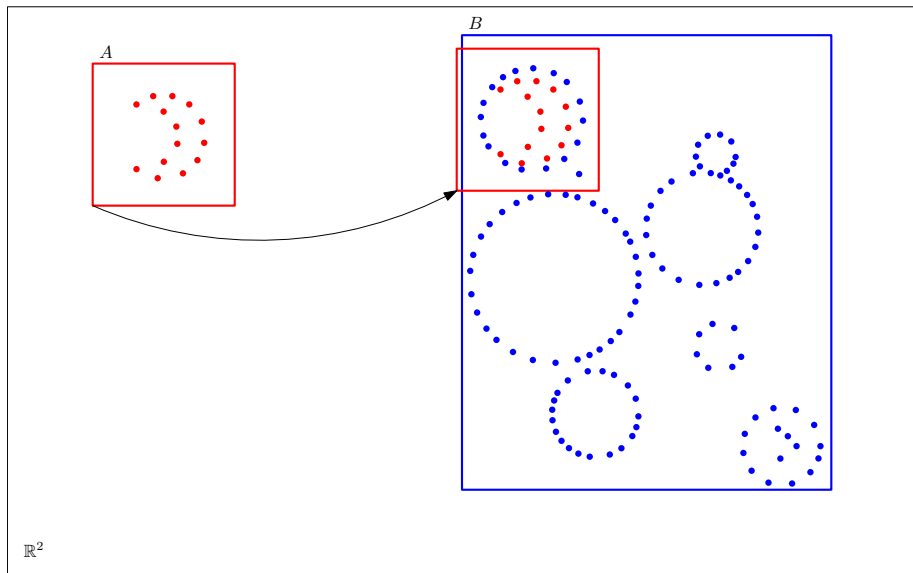
December 2018

Example

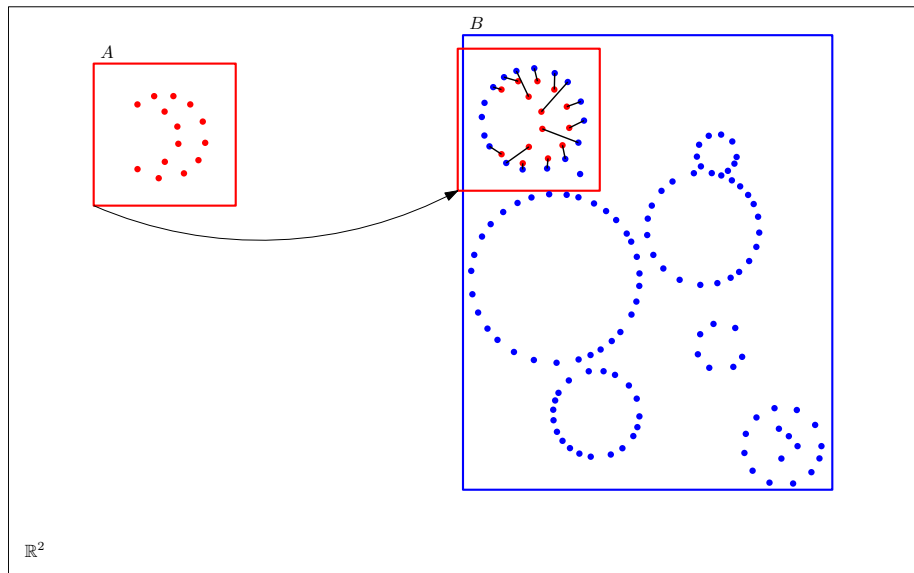


\mathbb{R}^2

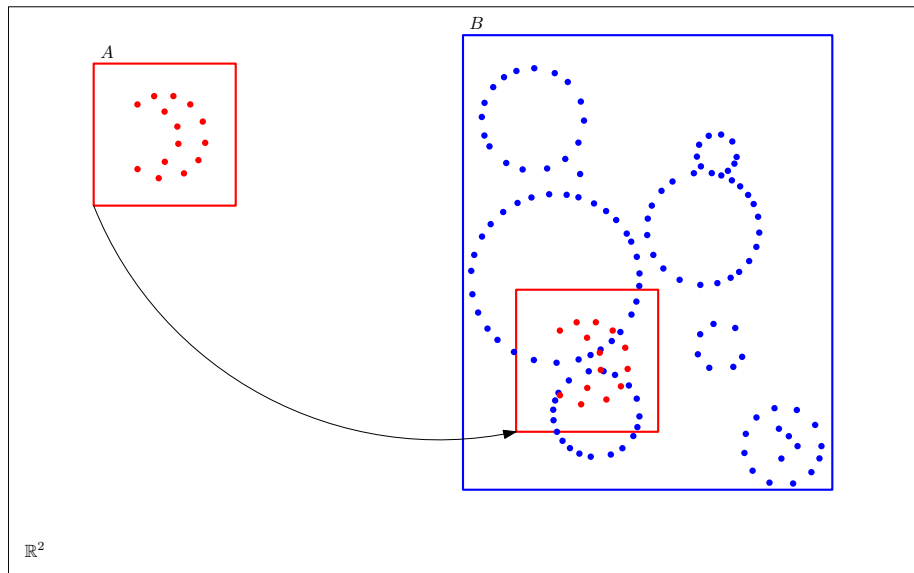
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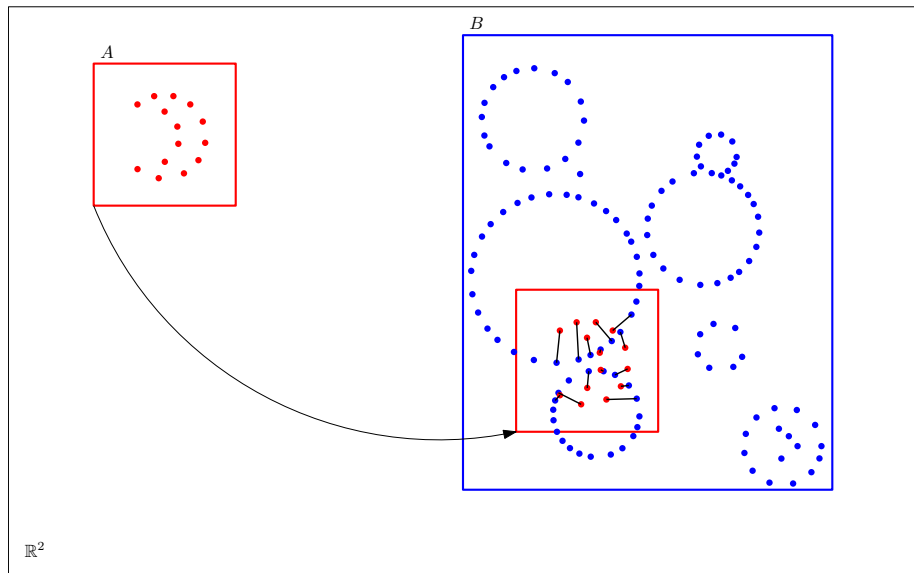
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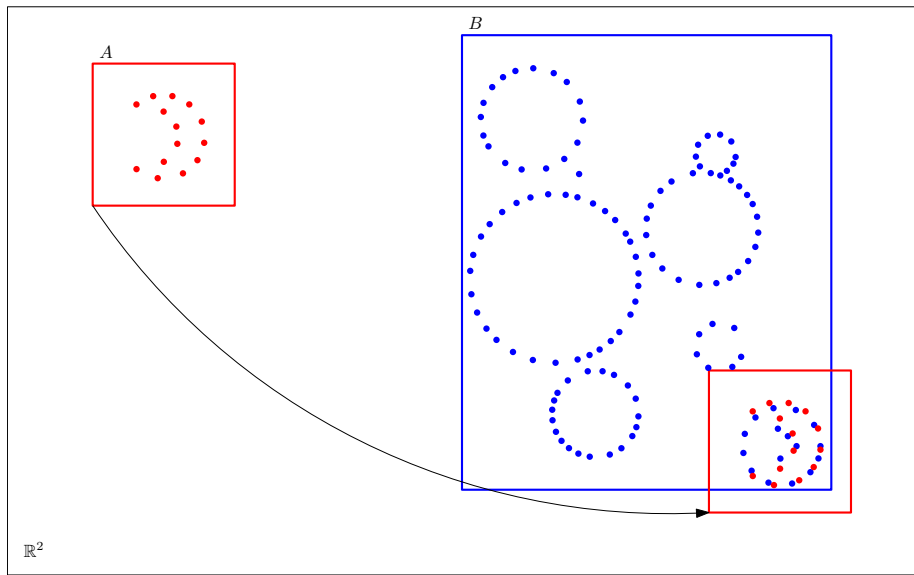
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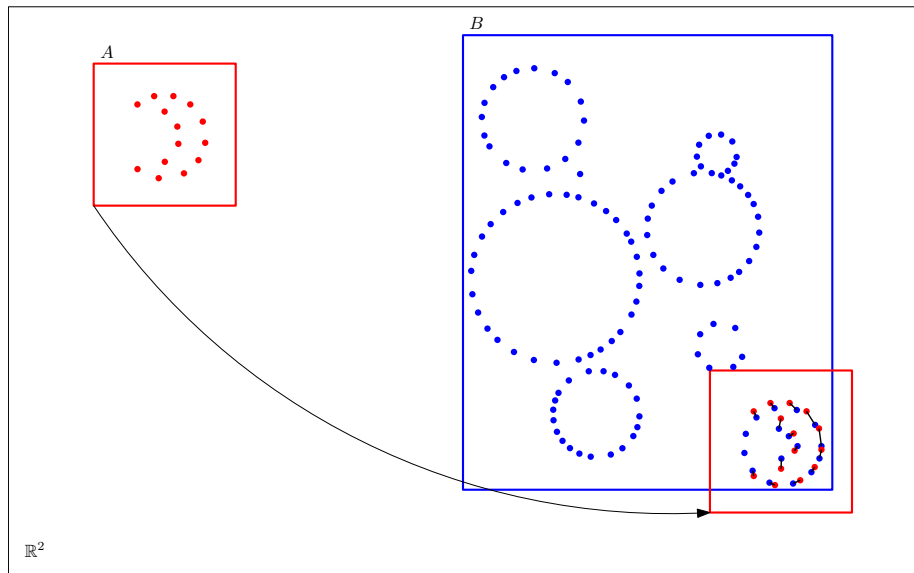
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Example



Cost function

- ▶ Given point sets A, B , with $|A| = m$ and $|B| = n$, match A into an m -subset of B after translation t .
- ▶ For matching M and translation t , define the **root-mean-sqaure (RMS) cost** of the matching:

$$\text{cost}(M, t) := \left[\frac{1}{m} \sum_{(a,b) \in M} \|a + t - b\|^p \right]^{1/2}$$

- ▶ Can generalize to p -th power/ p -th root (versus 2), and matching of size k (versus m).
- ▶ Best matching cost at each translation:

$$\text{cost}^*(t) := \min_{\text{matching } M} \text{cost}(M, t)$$

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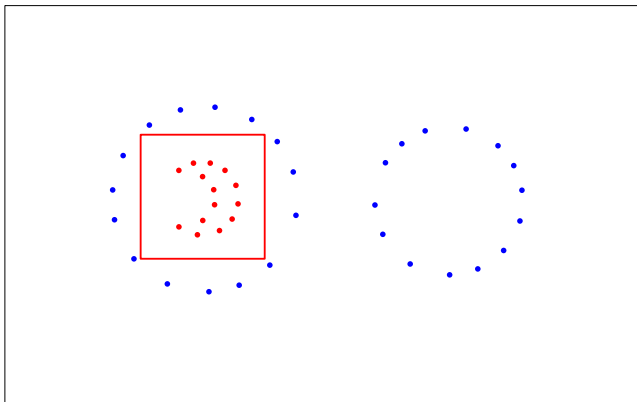
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Cost function under perturbations

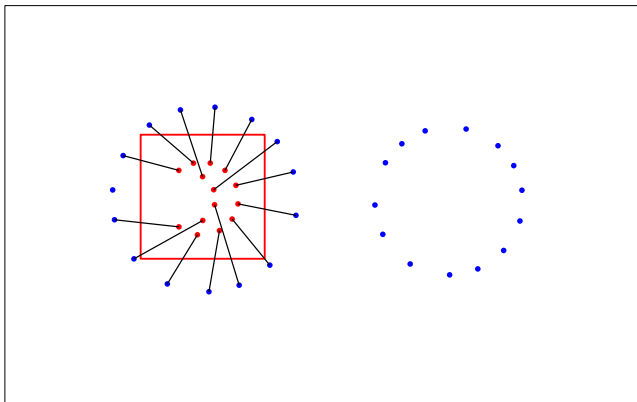
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► How many distinct matchings appear in $\text{cost}^*(t)$?

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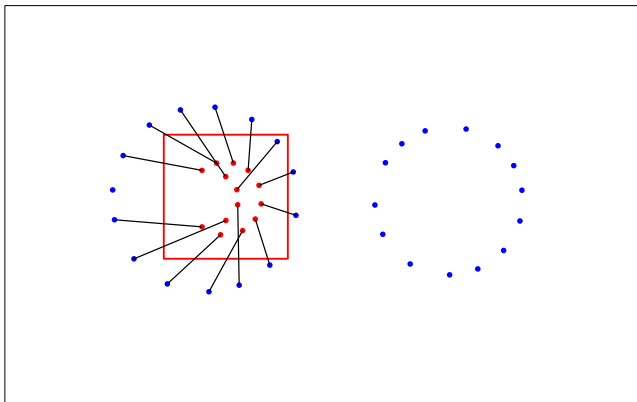
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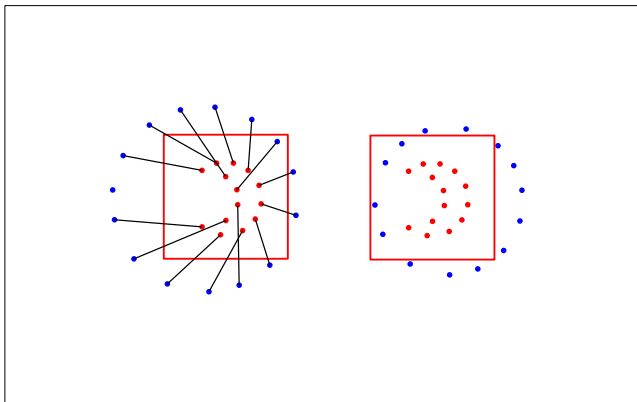
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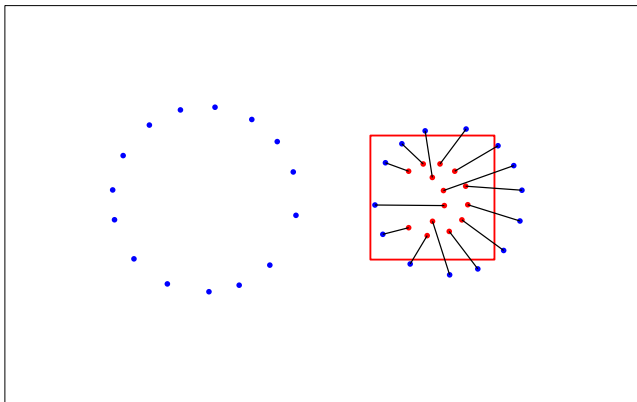
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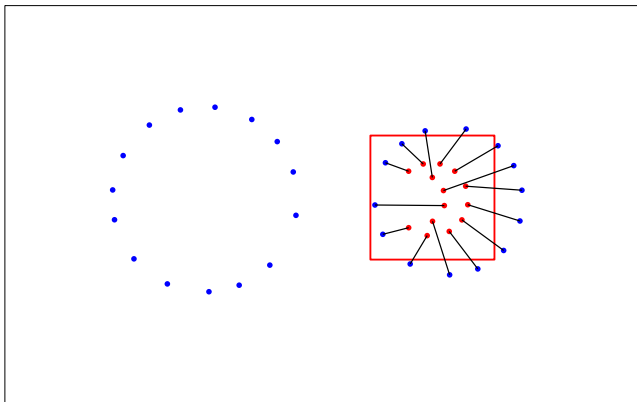
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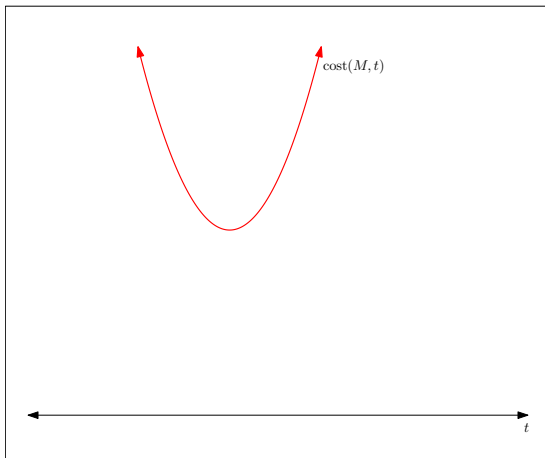
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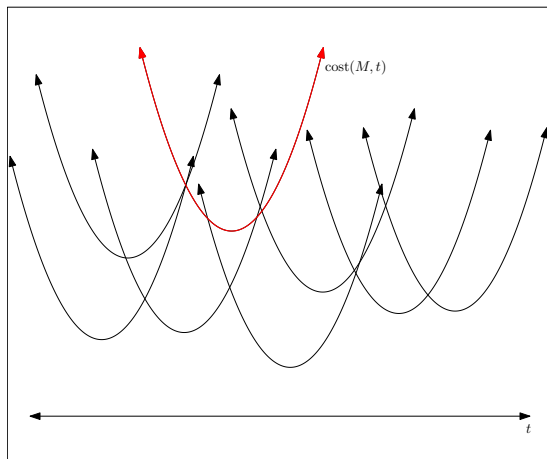
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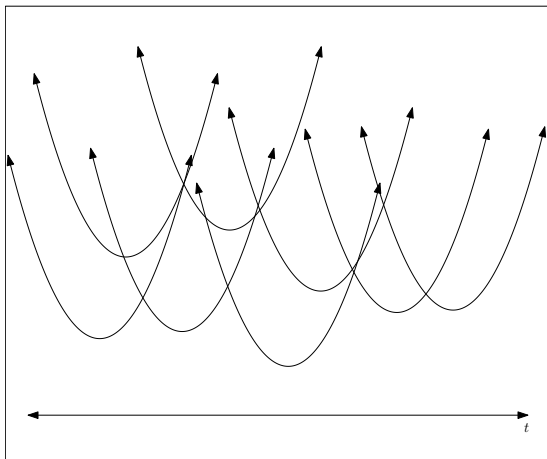
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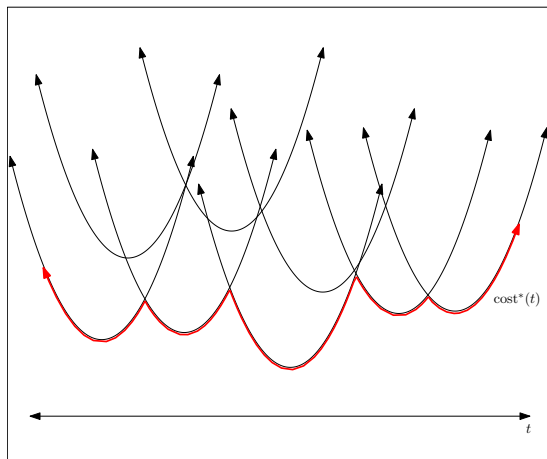
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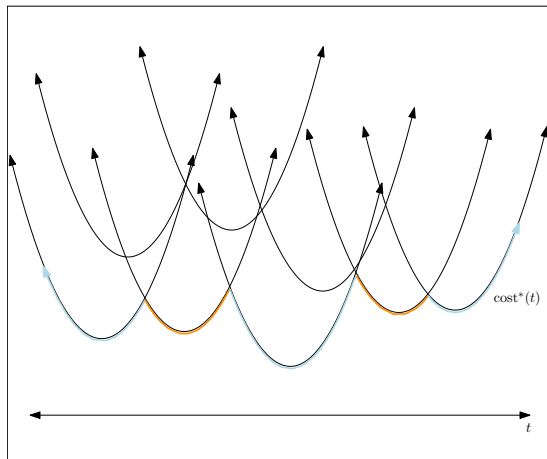
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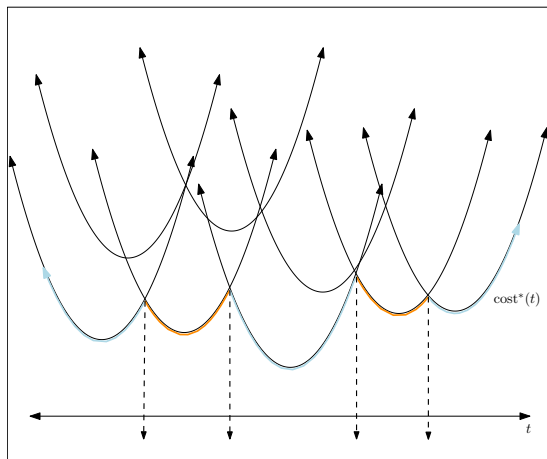
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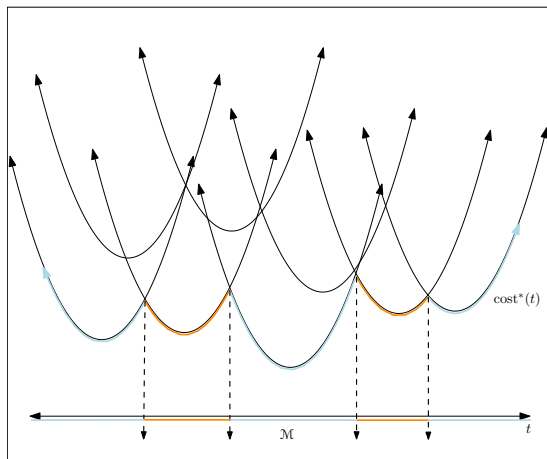
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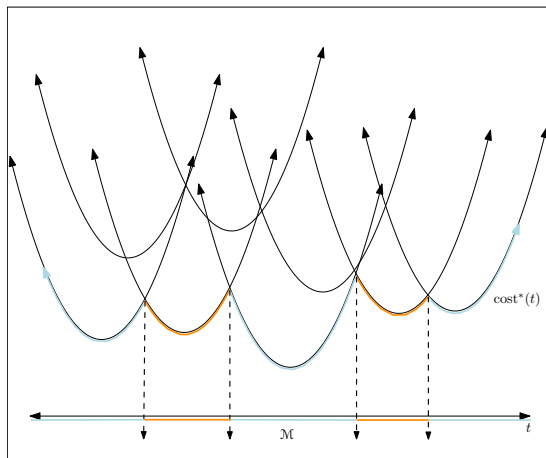


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How many distinct matchings? (2-dimensional)



- ▶ How many distinct matchings appear in $\text{cost}^*(t)$?
- ▶ What is the combinatorial complexity of \mathcal{M} ?

Questions and prior results

1. How quickly can we *compute* t^* , a global minimum of $\text{cost}^*(t)$?
 2. What is the *combinatorial complexity of* \mathcal{M} ?
 - ▶ [Rote 10]: in 1D, at most $m(n - m) + 1$.
 - ▶ [Ben-Avraham *et al.* 14]: $O(n^2 m^{3.5} (e \ln m + e)^m)$
- ▶ Open to find t^* in polytime, and whether \mathcal{M} has polynomial complexity.
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Approximating \mathcal{M} (1-dimensional)

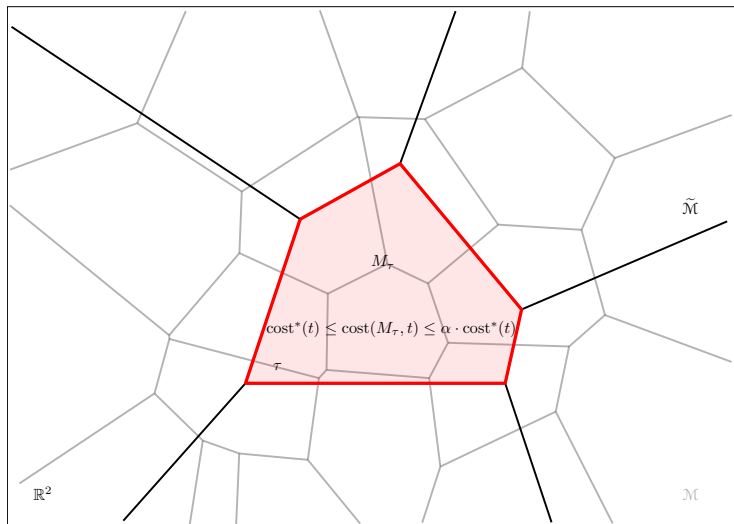
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Our results (approximation helps)

1. How quickly can we *compute* t^* , a global minimum of $\text{cost}^*(t)$?

Theorem

In $\text{poly}(m, n, \varepsilon^{-1})$ time, can compute a $(1 + \varepsilon)$ approximation to $\text{cost}^(t^*)$ by exploring the cells of $\tilde{\mathcal{M}}$.*

2. What is the *combinatorial complexity of \mathcal{M}* ? Is it polynomial?

Theorem

In $\text{poly}(m, n, \varepsilon^{-1})$ time, can construct a $(1 + \varepsilon)$ approximate diagram $\tilde{\mathcal{M}}$ of complexity $O(n\varepsilon^{-2} \log \varepsilon^{-1})$.

1. The set of **point-to-point translations** give a constant approximate diagram of size mn .
2. Using exponential grids, constant $\rightarrow (1 + \varepsilon)$ **approximation** of size $O(mn\varepsilon^{-2} \log \varepsilon^{-1})$.
3. Reduce size to $O(n\varepsilon^{-2} \log \varepsilon^{-1})$ by clustering.

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Point-to-point translations

- ▶ *Point-to-point translations* [Cabello et al. 08]:

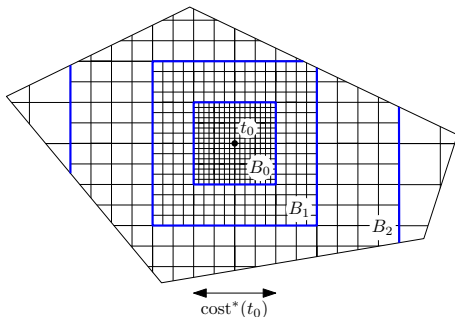
$$T := \{t_{ba} = (b - a) \mid a \in A, b \in B\}$$

- ▶ Enough to look at the optimal matching of each $t \in T$.

Constant approximate diagram from point-to-point translations

- ▶ $\tilde{\mathcal{M}}$ is a constant-approximate diagram of size $|T| = mn$.

$O(1) \rightarrow (1 + \varepsilon)$ approximation



- $(1 + \varepsilon)$ approximate diagram of size $O(|T|\varepsilon^{-2} \log \varepsilon^{-1}) = O((mn)\varepsilon^{-2} \log \varepsilon^{-1})$

Near-linear size: clustering T

- ▶ Any $O(1)$ approx. diagram is enough for the $(1 + \varepsilon)$ diagram.
- ▶ Reduce size from $O(mn) \rightarrow O(n)$.

Open questions

1. Is the complexity of \mathcal{M} polynomial?
2. Approximate diagrams for rotations? Rigid transforms?

The End

Thank you.