





otwithnvariances

First Approach:

39

39

- Choose an invariant class (e.g., rotations, reflections)

Want find best (soft) matching and best global registration between two point clouds







• Variation of this objective have been proposed in many contexts (ICP, SoftAssign, Procrustes, etc)

-often tailored to 2D/3D

- Poor scalability / stability

• We seek a formulation that is sufficiently general yet efficiently optimizable.

$$\min_{\Gamma \in \Pi(\mathbf{a}, \mathbf{b})} \min_{P \in \mathcal{F}} \sum_{ij} \Gamma_{ij} d(\mathbf{x}^{(i)}, \mathbf{y}^{(j)})$$



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Classic OT

$\mathcal{F}$ -Invariant OT

ANM, Jeggekkola. AISTATS 2019

# First Approach: OT with Invariances

AM, Jegelka, Jaakkola. AISTATS 2019

- Choose an invariance class  $\mathcal{F}$  (e.g., rotations, reflections)
- Want to find best (soft) matching **and** best global registration between spaces

Classic OT

$$\min_{\Gamma \in \Pi(\mathbf{a}, \mathbf{b})} \sum_{ij} \Gamma_{ij} d(\mathbf{x}^{(i)}, \mathbf{y}^{(j)})$$

$\mathcal{F}$ -Invariant OT

$$\min_{\Gamma \in \Pi(\mathbf{a}, \mathbf{b})} \min_{\mathbf{P} \in \mathcal{F}} \sum_{ij} \Gamma_{ij} d(\mathbf{x}^{(i)}, \mathbf{P}\mathbf{y}^{(j)})$$

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- We seek a formulation that is **sufficiently general** yet **efficiently optimizable**.

# Invariance with Schatten-balls