MEDIAN TRAJECTORIES

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• I Introduction

- I Introduction
 - Motivation
 - Data representatives

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- II Defining the median

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- Conclusion

I INTRODUCTION

MOTIVATIONProblem

- Problem
 - Planar domain

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 - Big collection of trajectories



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 - Big collection of trajectories
 - Build catalogue of 'common' trajectories



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 - Cluster the trajectories
 - Pick a good representative for each cluster
- ... how did we do that second step?

• Input: a set of 'similar' trajectories

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 - Shape should represent the whole set of input trajectories

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DATA REPRESENTATIVES

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 - Which trajectory do we pick?



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- No?
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- Yes?
 - Which trajectory do we pick?
 - There may not be any good representative!



- No?
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 - May interfere with environment!
- Yes?
 - Which trajectory do we pick?
 - There may not be any good representative!
- Use pieces of different trajectories



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II DEFINING THE MEDIAN

• For *x*-monotone trajectories...



- For *x*-monotone trajectories...
 - Take the median at each *x*-coordinate



- For *x*-monotone trajectories...
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 - Why not do the same thing?
- We call this the *simple median* of a set of curves



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- Problem
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- Solution
 - Plant a tree



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SHORTCUTS

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 - Place a *pole*
 - Require the median to go around it
- ... how do we steer the median correctly around these poles?

HOMOTOPYIngredients

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 - One punctured plane

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 - Two points s and t in the plane

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- Consider a point in a space E
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 - E' is simply connected






- For homotopic trajectories...
 - Lift the trajectories into the covering space



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 - Ignore crossings that are no longer there



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- For homotopic trajectories...
 - Lift the trajectories into the covering space
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 - The *homotopic median* is just the simple median in the covering space
- For non-homotopic trajectories...
 - Endpoint t is not the same!
 - It doesn't work

• Given a set of trajectories, can we compute a reasonable set of poles?

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- Given a set of trajectories, can we compute a reasonable set of poles?
- Place poles in...



- Given a set of trajectories, can we compute a reasonable set of poles?
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 - Big faces?



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 - Faces where they preserve the homotopy?



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 - Both at the same time?



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- Not uniquely defined!

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III RESULTS

- *n*: Number of input vertices
- *h*: Number of input poles
- A: Complexity of arrangement of input
- k: Complexity of output trajectory

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- A: Complexity of arrangement of input
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 - $O(n^2 \log n)$ time
 - $O((n+k)\dot{\alpha}(n)\log n)$ time
- Homotopic median
 - $O(n^{2+\varepsilon})$ time
 - $O((n\sqrt{h}+k)\alpha(n)\log n + h^{1+\varepsilon} + A)$ time

• Trajectory generator

- Trajectory generator
 - Random walk towards a series of waypoints



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 - Random walk towards a series of waypoints
 - Simple or self-intersecting trajectories



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- Measures of interest
 - Angular change
 - Complexity

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 - Places poles in faces that are large enough
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- Measures of interest
 - Angular change
 - Complexity
 - Length

- Complexity
 - No self-intersections
 - Self-intersections

S 345%319% 207%343%

Н

 Complexity No self-intersections Self-intersections 	S 345% 207%	H 319% 343%
Length		
 No self-intersections 	96%	99%
 Self-intersections 	51%	96%

 Complex No self-in Self-inter 	ity ntersections rsections	S 345% 207%	H 319% 343%
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• This work

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 - Two definitions for median trajectory
 - Efficient algorithms for computing them
 - Quantitative evaluation on generated data

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- Future work

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- Future work
 - More intelligent automatic pole placement?
 - Evaluation on real-world data?
 - Understand better what makes a us accept a certain curve as a good median



