

Fréchet Distance Between Uncertain Trajectories

Computing Expected Value and Upper Bound

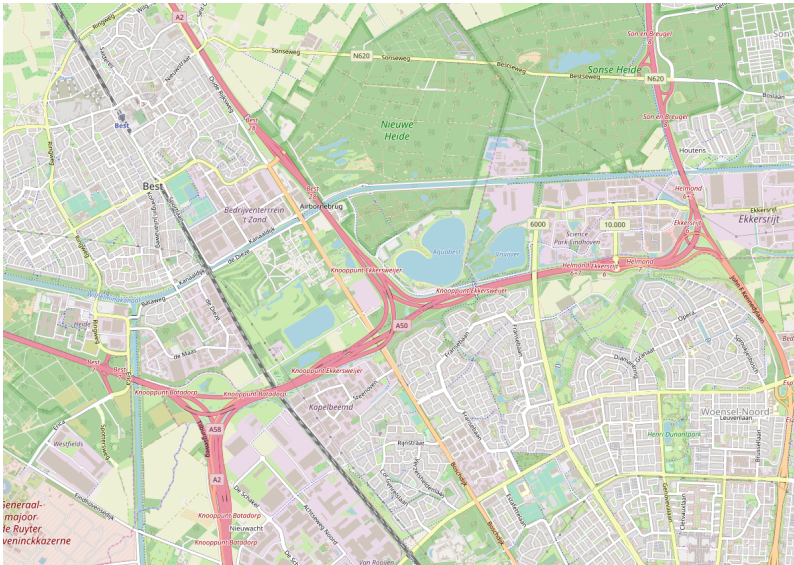
Kevin Buchin¹ Maarten Löffler² Aleksandr Popov¹ Marcel Roeloffzen¹

¹Department of Mathematics and Computer Science
Eindhoven University of Technology

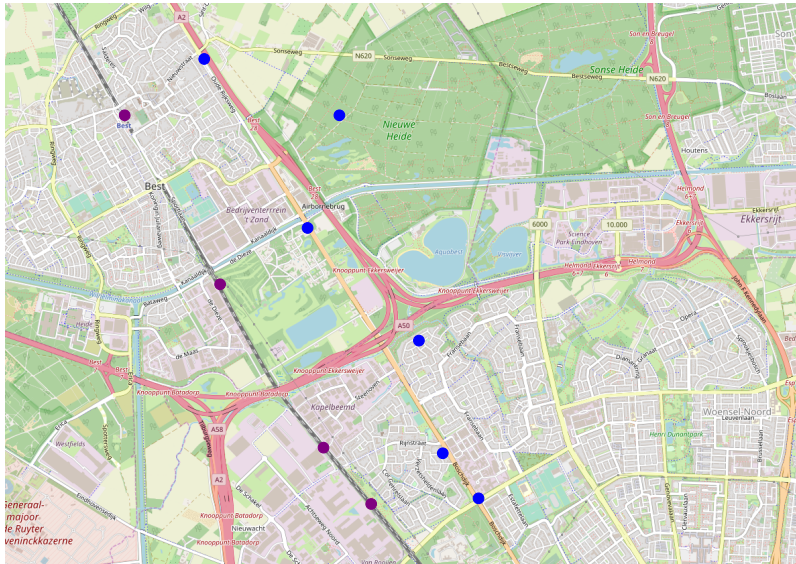
²Department of Information and Computing Sciences
Utrecht University

16th March 2020

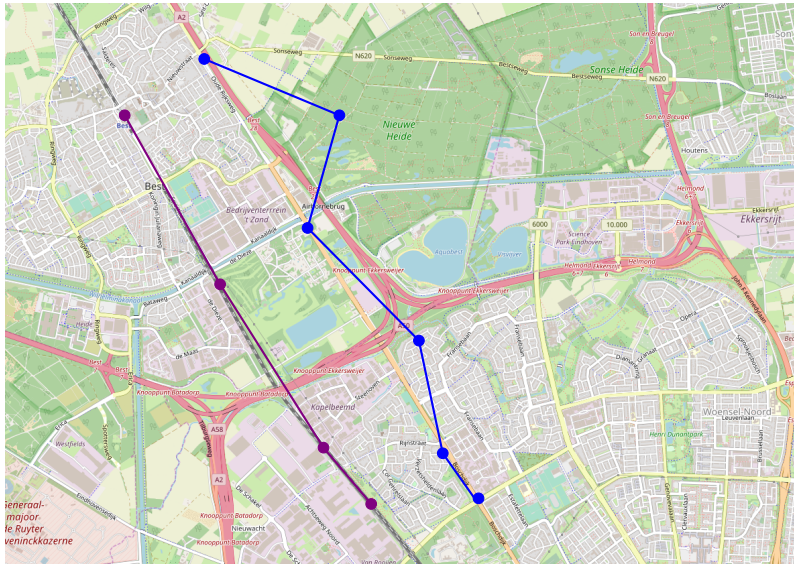
Why (uncertain) trajectories?



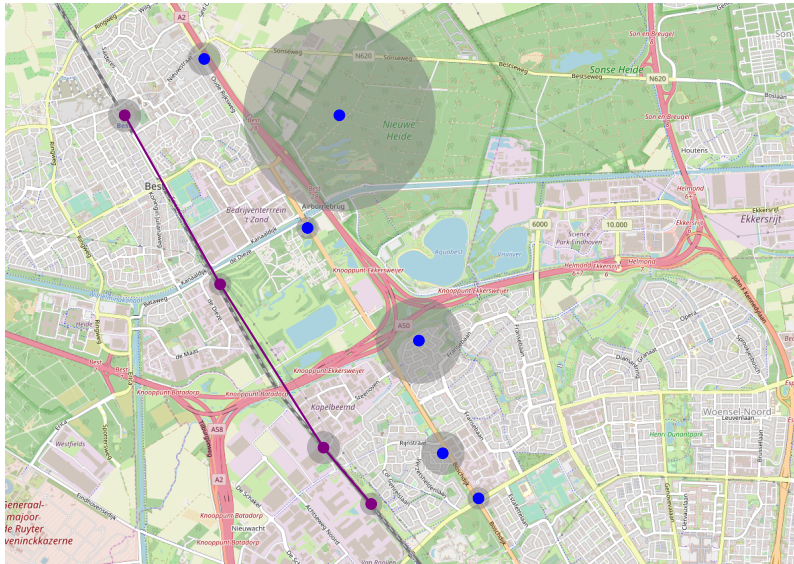
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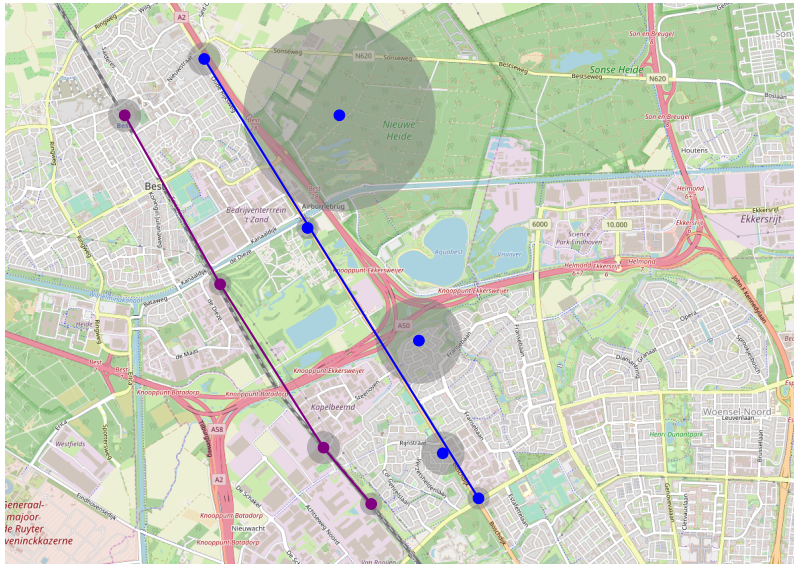
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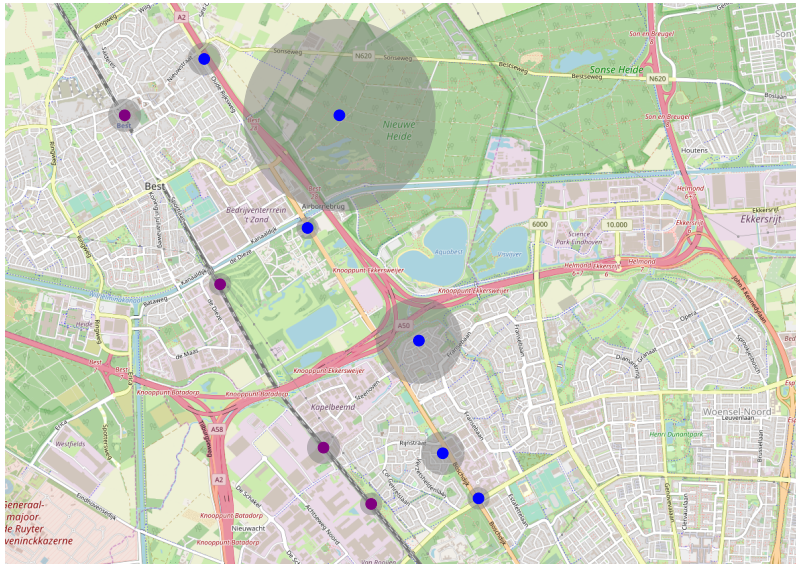
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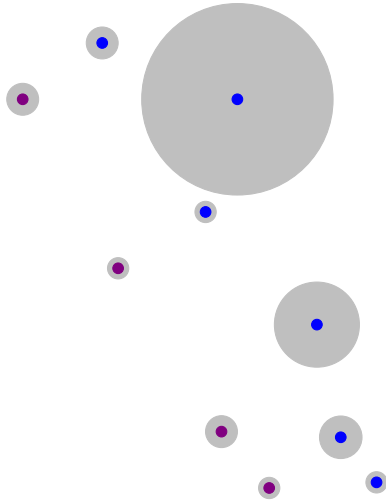
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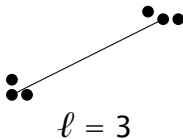
Uncertain trajectories

Measurement uncertainty, regions connected with line segments.

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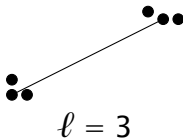
Indecisive point:
 ℓ options per point



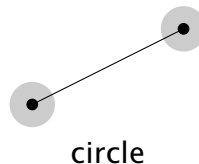
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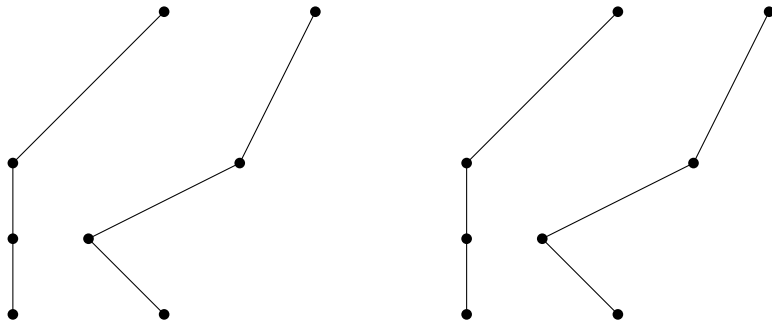


Imprecise point:
Connected region



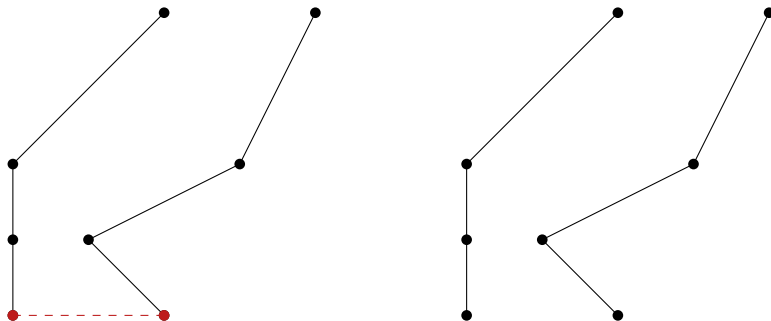
Similarity measures

Discrete Fréchet distance and continuous Fréchet distance:



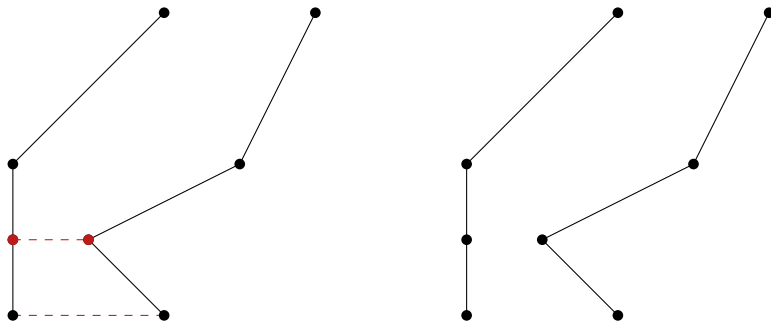
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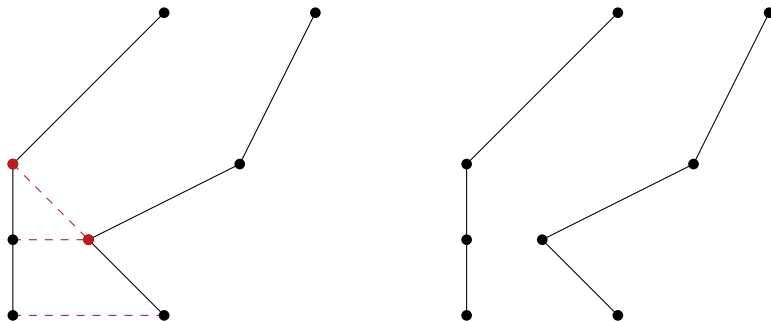
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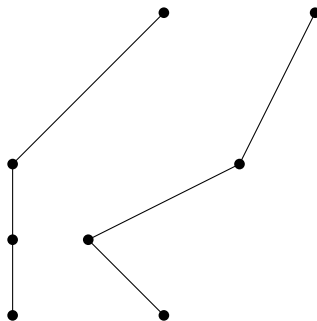
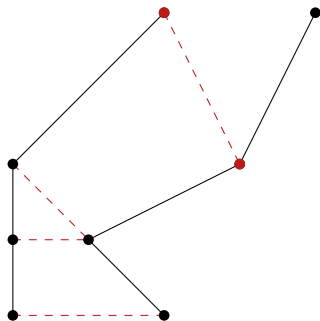
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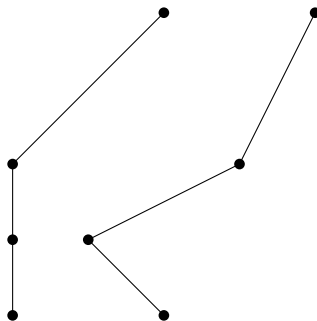
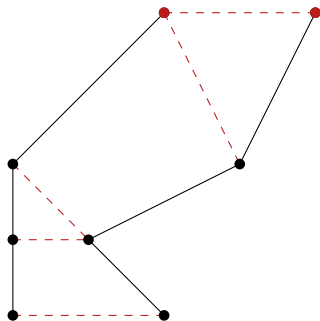
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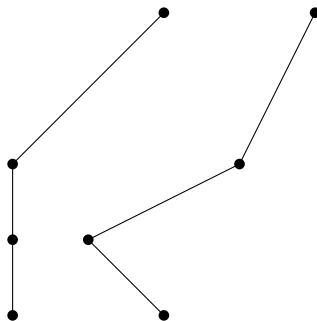
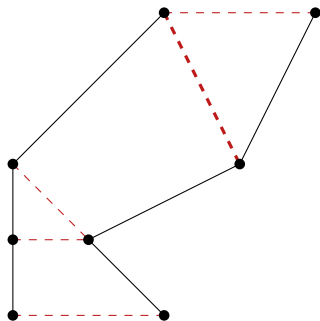
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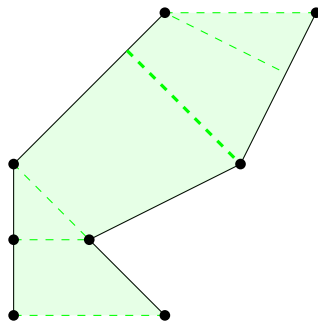
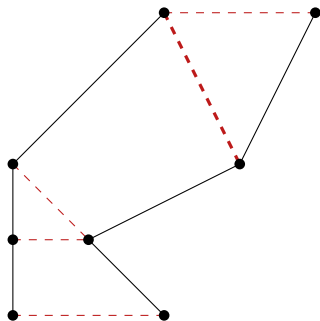
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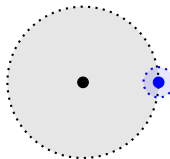
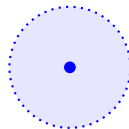
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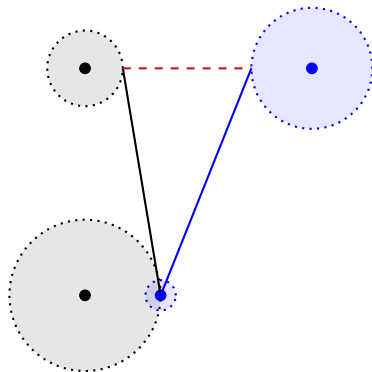
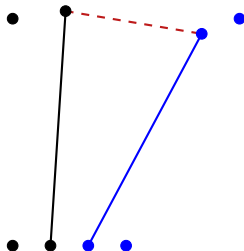
Fréchet distance on uncertain trajectories

Lower bound? Upper bound? Expected value?



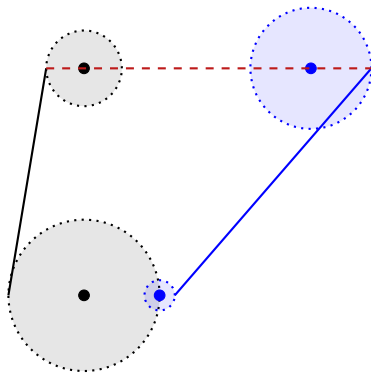
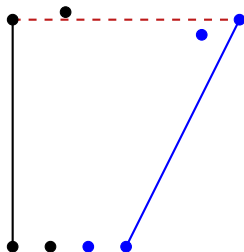
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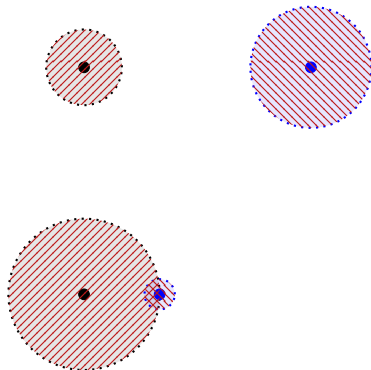
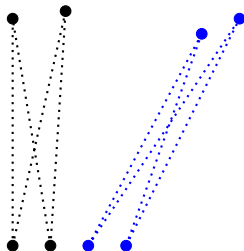
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Fréchet distance on uncertain trajectories

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Overview

		indecisive	imprecise	
			disks	line segments
discrete FD	LB	Polynomial*	Polynomial*	Polynomial*
	UB	NP-complete	NP-complete	NP-complete
	Exp	#P-hard	—	#P-hard
FD	LB	Polynomial [†]	—	NP-complete [†]
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* Ahn et al., 2012.

[†] Joint work with Fan and Raichel, submitted.

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Indecisive: Polynomial-time algorithms with time bands for all cases.

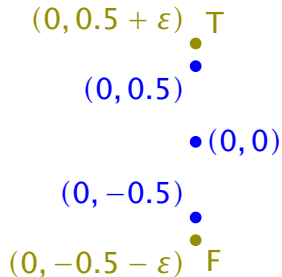
Hardness results

Construction: Indecisive, discrete FD, upper bound

Reduction from SAT.

Two curves:

- ▶ Precise curve:
formula structure;
- ▶ Indecisive curve:
variable
assignment.

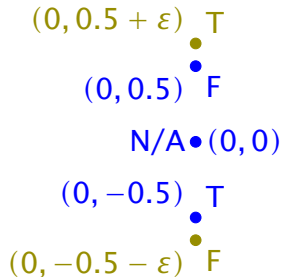


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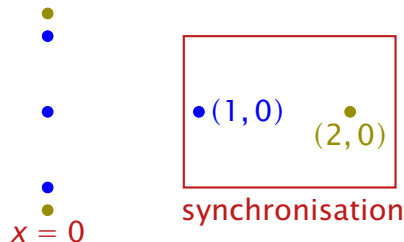


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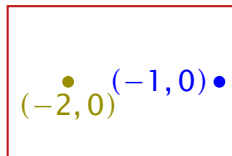


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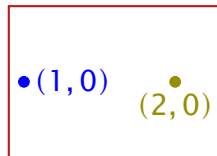
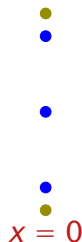
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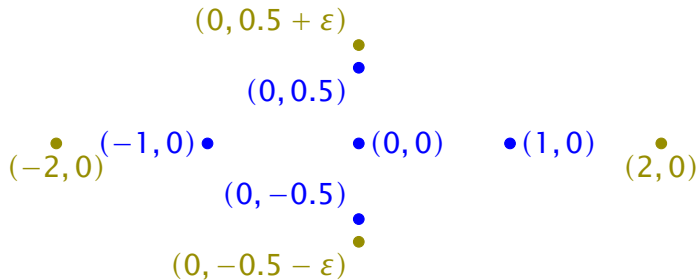


synchronisation



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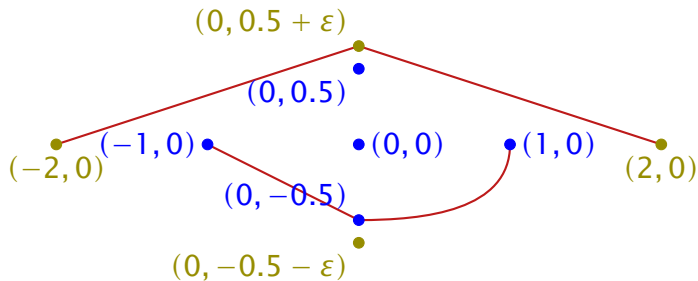
Construction: example



$$C = x_1 \vee x_2$$

Realisation: $x_1 = \text{T}$, $x_2 = \text{F}$, $x_3 = \text{F}$.

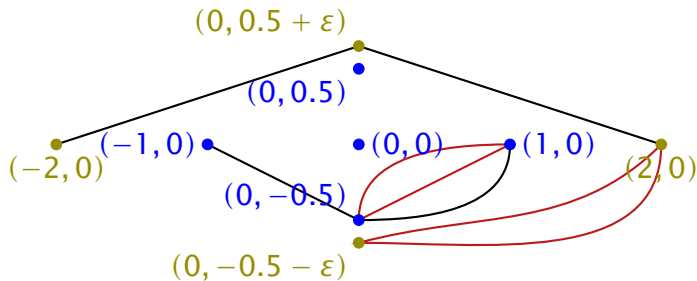
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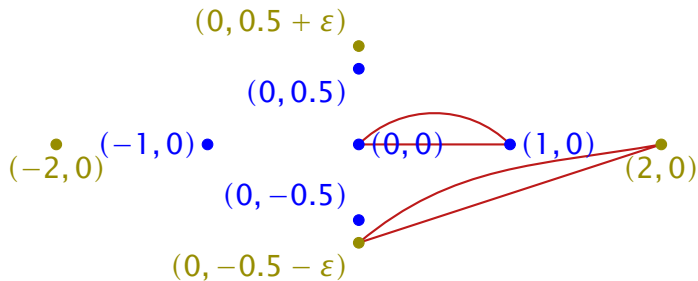
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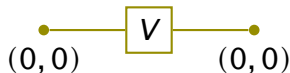
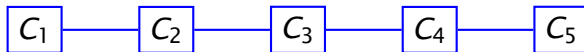
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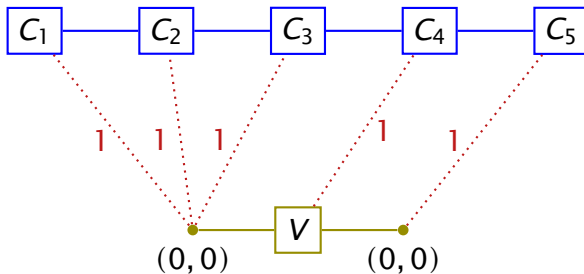
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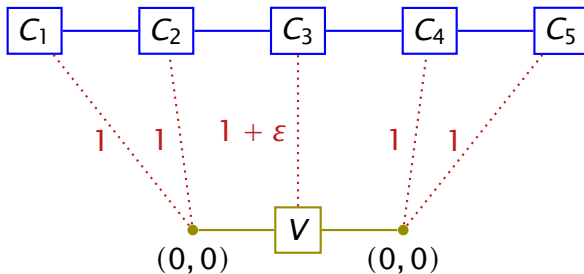


Construction: Indecisive, discrete FD, upper bound



$$C_4 = F$$

Construction: Indecisive, discrete FD, upper bound



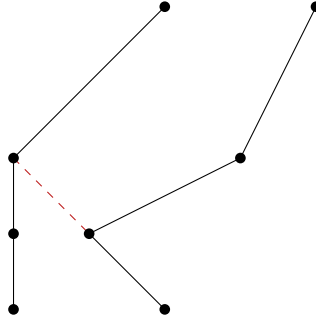
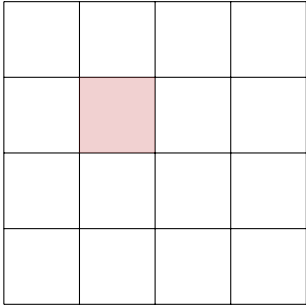
$$C_i = T \text{ for all } i$$

Hardness results

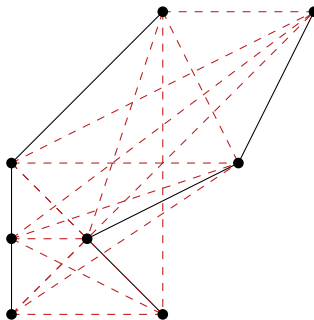
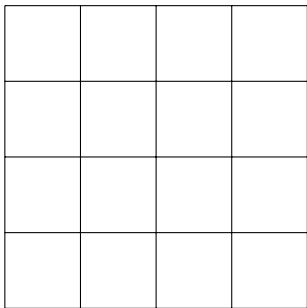
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Algorithms using time bands

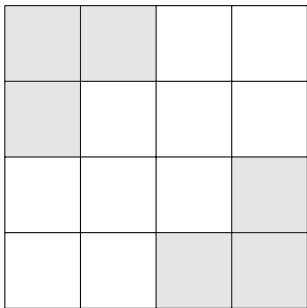
Time bands: idea



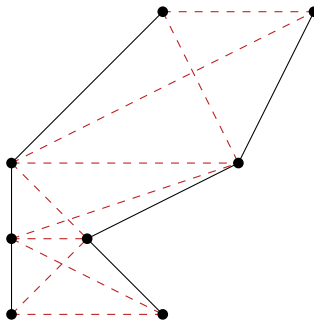
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$w = 1$



Time bands: results

Time band width w , indecisive trajectories with ℓ options, length n :

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- ▶ UB/Exp FD: polynomial in n .

Summary

Hardness results:

		indecisive	imprecise disks	line segments
discrete FD	UB Exp	NP-complete #P-hard	NP-complete —	NP-complete #P-hard
FD	UB Exp	NP-complete #P-hard	NP-complete —	NP-complete —

Time bands:

Polynomial-time algorithms for constant-width bands for UB and Exp discrete FD and FD on indecisive trajectories.