

# Inapproximability for planar embedding problems

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# Metric Space

$M = (X, D)$  is a metric space.

- $X$  is a set.
- $D$  is a distance function on  $X$ , i.e., satisfies triangle inequality.

## Examples

- Any normed space.
- Graphs with shortest path distance.
- ...
- ... ..

## Embedding between metric spaces

- Given  $M = (X, d_X)$  and  $M' = (Y, d_Y)$ .
- Embedding  $f : X \mapsto Y$ .

### Metric distortion

$f$  has *distortion*  $a$  if

$$\forall x_1, x_2 \in X \quad d_X(x_1, x_2) \leq d_Y(f(x_1), f(x_2)) \leq a \cdot d_X(x_1, x_2).$$

- $\text{dist}(f) = \max \text{exp}(f) \times \max \text{contr}(f)$
- Well-studied subject: *Worst case* distortion.
- **Relative Embeddings:** Given  $X$ , find near-optimal embedding  $f : X \mapsto Y$  efficiently.

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# Computational problems (Approximate min. distortion)

## Bijection and Injection

### Bijection

Given two finite metric spaces  $X, Y$  of the same size  $n$ . Approximate the minimum distortion bijection  $f : X \mapsto Y$ .

Introduced in [KRS04].

### Injection

Given finite metric space  $X$  of size  $n$  and infinite metric space  $Y$  with fixed dimensionality. Approximate the minimum distortion injection of  $f : X \mapsto Y$ .

**Remark:** Although different problems, share the same approximability.

**Notation**  $\alpha$  vs.  $\beta$ : Given  $X$  it is NP-hard to check if  $\exists f : X \mapsto Y$  with distortion  $\leq \alpha$  or every  $f$  has distortion  $> \beta$ . Notice that  $1 \leq \alpha < \beta$ .

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## Related Work

Dimension	Approximability		References
	Bijection ( $X, Y \subseteq \mathbb{R}^d$ )	Injection ( $Y = \mathbb{R}^d$ )	
$d = 1$	$OPT$ , if $\text{dist} \leq 3 + 2\sqrt{2}$ $OPT$ , if $\text{dist} \leq 5 + 2\sqrt{6}$ $\text{poly}(n)$ vs. $\text{poly}(n)$	$\text{poly}(n)$ vs. $\text{poly}(n)$	[KRS04] [CMO <sup>+</sup> 08] [HP05], [BCIS05]
$d = 2$	$c_1$ vs. $c_2$	NP-hard $c'_1$ vs. $c'_2$ $\text{poly}(n)$ vs. $\text{poly}(n)$	[BCIS06] <b>This paper</b> [MS08]
$d \geq 3$	$a$ vs. $3a$ $a$ vs. $\Omega(\log^{1/4-\varepsilon} n)a$	NP-hard $c$ vs. $\text{poly}(n)$	[PS05], [Edm07] [KS07], [MS08]

**Notation**  $a$  vs.  $\beta$ : Given  $X$  it is NP-hard to check if  $\exists f : X \mapsto Y$  with distortion  $\leq a$  or every  $f$  has distortion  $> \beta$ . Notice that  $1 \leq a < \beta$ .



# Our Results

It is NP-hard to decide whether the minimum distortion of

- 1 a *bijection* between two finite subsets of  $\mathbb{R}^2$  under  $\ell_2$  is at least  $\alpha$  or at most  $\beta$ , where  $1 < \alpha < \beta$ .
- 2 an *injection* of a finite metric space onto  $\mathbb{R}^2$  under  $\ell_\infty$  is at least  $\alpha'$  or at most  $\beta'$ , where  $1 < \alpha' < \beta'$ .

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- 1 a *bijection* between two finite subsets of  $\mathbb{R}^2$  under  $\ell_2$  is at least  $a$  or at most  $\beta$ , where  $1 < a < \beta$ . **Core of the talk**
- 2 an *injection* of a finite metric space onto  $\mathbb{R}^2$  under  $\ell_\infty$  is at least  $a'$  or at most  $\beta'$ , where  $1 < a' < \beta'$ .

# Bijection Proof Outline

## Outline

- 1 Given 3SAT formula  $\phi$ . Construct instance of bijection problem.
- 2 Construct pair  $X, Y \subseteq \mathbb{R}^2$ ,  $|X| = |Y|$  s.t.
  - If  $\phi$  is SAT, then  $X$  embeds into  $Y$  with distortion at most  $\alpha$ .
  - If  $f : X \mapsto Y$  bijection with distortion at most  $\beta$ , then  $\phi$  is SAT.

## Key Ideas:

- **Locally** there are *two* possible low-distortion bijections between  $X \rightarrow Y$ .  
*Encode* binary decision.
- Bypass *crossing* obstacle (as in [PS05, KS07]) by considering different scales when crossing.

Description of construction: By giving subsets of input ( $\bullet \in X$ ) and target space ( $\circ \in Y$ ) *simultaneously*.

$$f(\bullet) \rightarrow \circ$$

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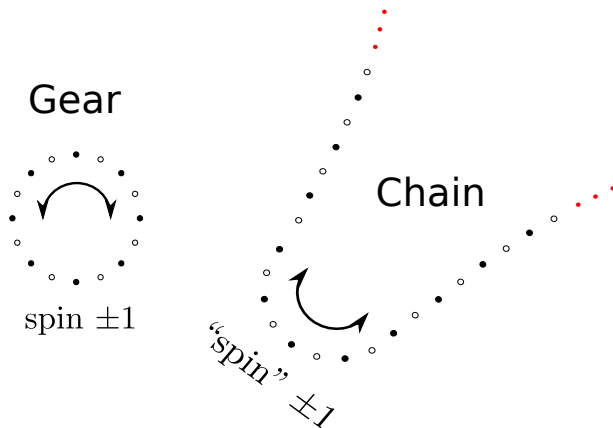
$$f(\bullet) \rightarrow \circ$$

# The construction

## Gears - Chains

Reminder

$f(\bullet) \rightarrow \circ$



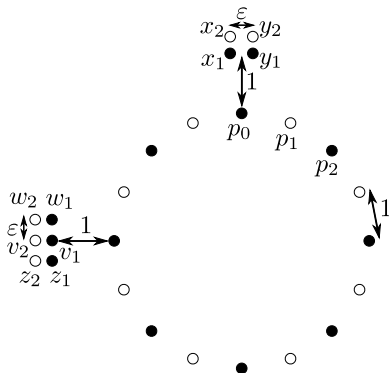
**Main Idea:** Sufficient low-distortion  $\implies$  gears spin and chains “spin”.

# The construction - Details

Gear

Reminder

$f(\bullet) \rightarrow \circ$



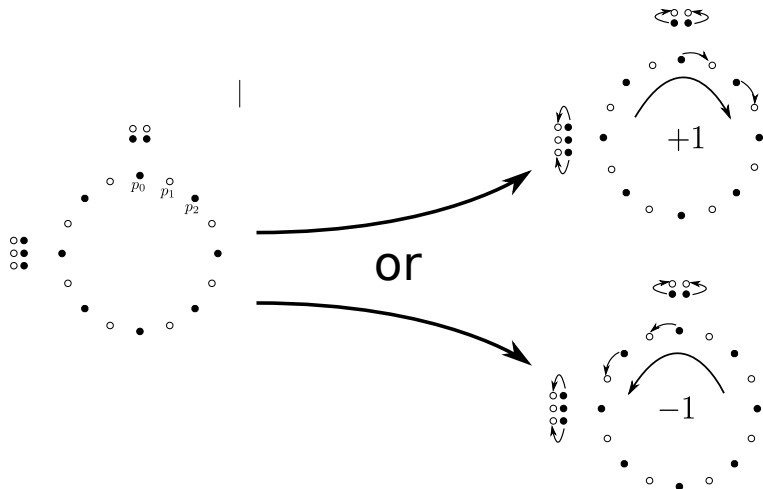
- Chain is similar but open.

# The construction - Details

Binary Decision

Reminder

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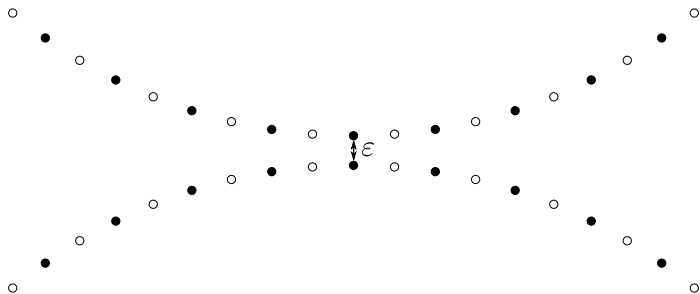
**Main Idea:** In any low-distortion  $f$  only **two** embeddings, i.e., spin clock-wise or counter-clockwise.

# The construction - Details

## Connecting Gear/Chain

Reminder

$$f(\bullet) \rightarrow \circ$$



**Key point** Sufficient low-distortion  $\implies$  neighbor gears and gears/chains have **opposite** spins.

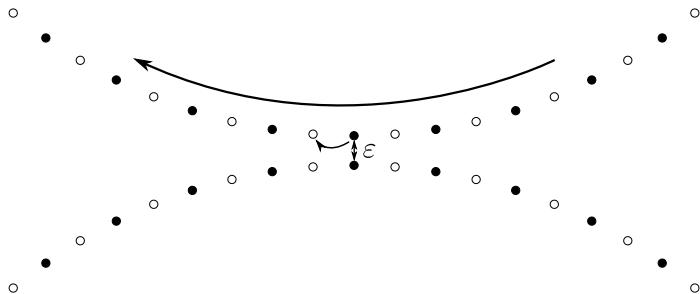


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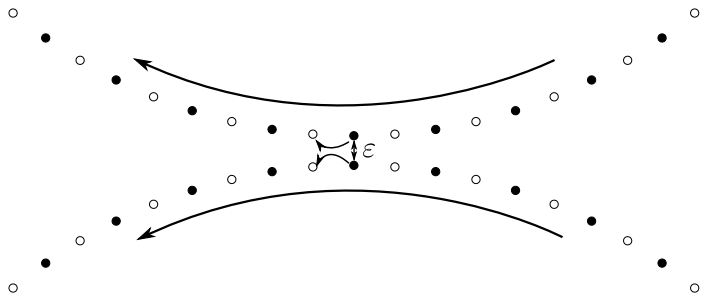
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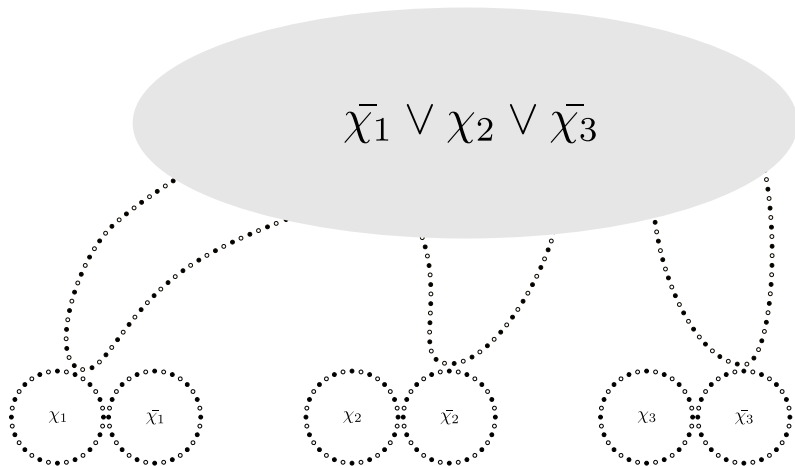
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# The construction

Connection - Clause

Reminder

$f(\bullet) \rightarrow \circ$



**Key point** Sufficient low-distortion  $\implies$  **opposite** spins.

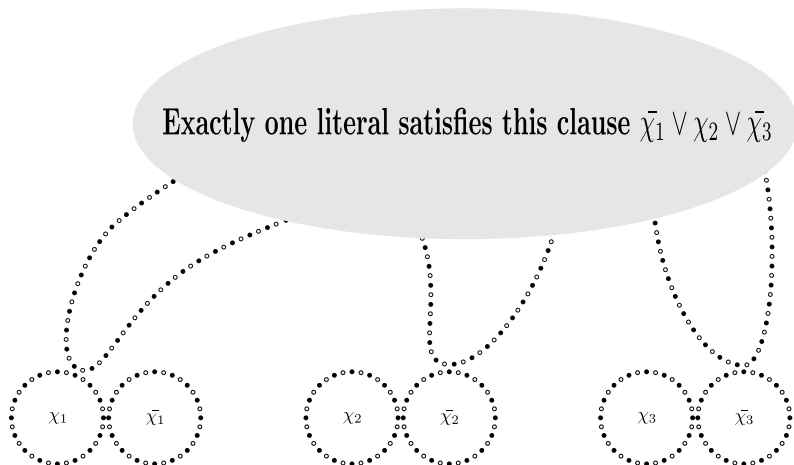
**Clause** Connect chains to encode a boolean constraint.

# The construction

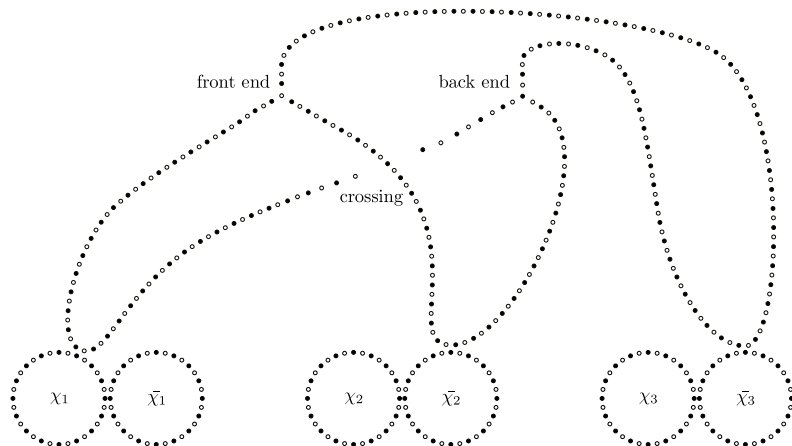
1-in-3 3SAT

Reminder

$f(\bullet) \rightarrow \circ$



- Restrict each clause to be satisfied by **exactly** one literal. 1-in-3 3SAT is NP-complete [Sch78].



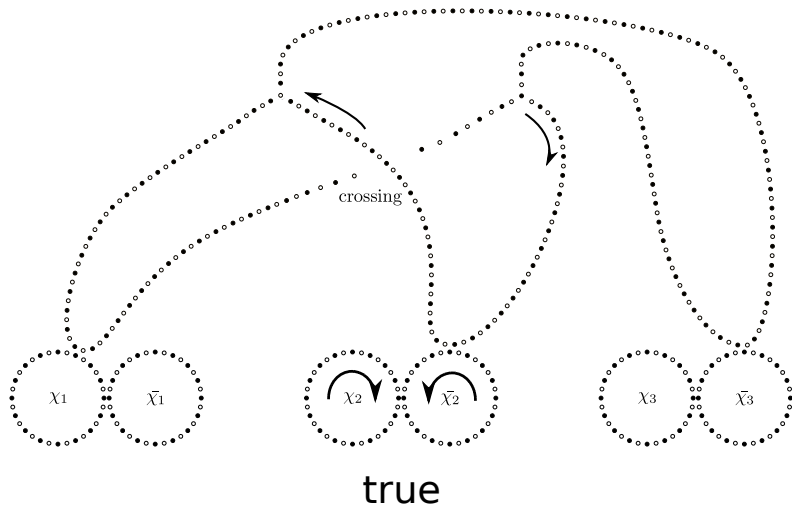
- Notice that  $|X| = |Y|$ .
- This subset of  $X, Y$  encodes the 1-in-3 clause  $\bar{x}_1 \vee x_2 \vee \bar{x}_3$ .

# Final construction

1-in-3 sat spin

Reminder

$$f(\bullet) \rightarrow \circ$$



true

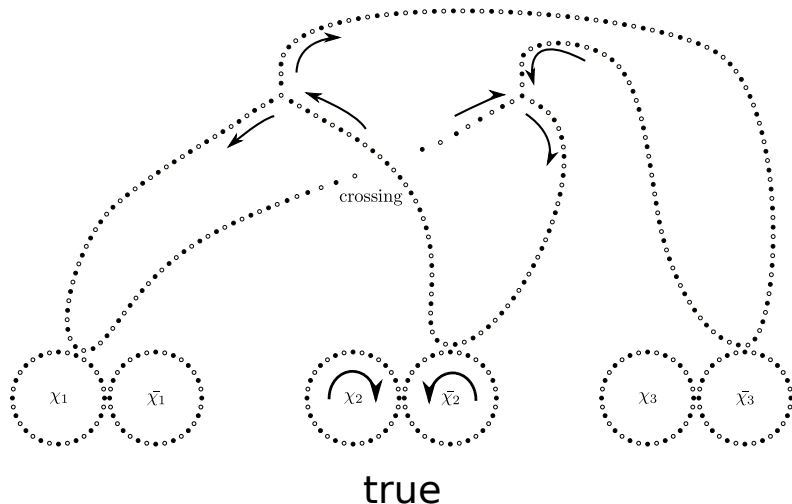
- A 1-in-3 SAT assignment of  $\bar{\chi}_1 \vee \chi_2 \vee \bar{\chi}_3$ .

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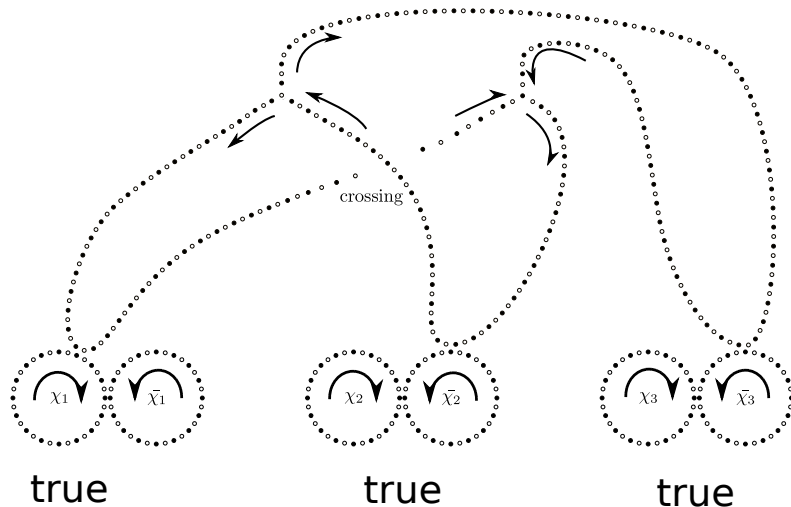
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# The construction - Details

How to deal with crossings?

Reminder

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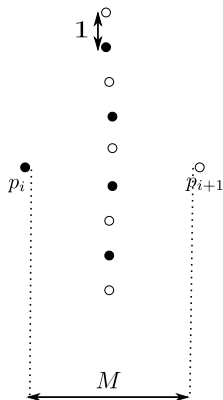
- Vertical and horizontal chains.

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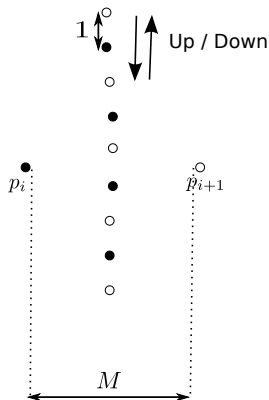
- Vertical and horizontal chains.
- Gap  $M \implies$  No vertical point is mapped to horizontal chain.

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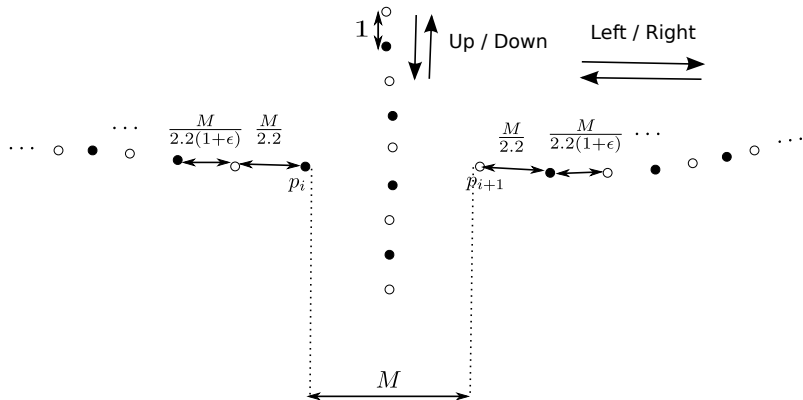
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- Vertical and horizontal chains.
- Gap  $M \implies$  No vertical point is mapped to horizontal chain.
- Horizontal chain's distances change exponentially.

# Analysis

We show the following:

## Yes instances

- If  $\phi$  is 1-in-3 3SAT, then exists  $f$  with distortion at most  $\alpha$ .
- Simple calculations give that  $\alpha = 3.61 + \epsilon$ .

## No instances

- For any  $f$  with distortion  $\leq \beta$ , we construct a 1-in-3 sat assignment for  $\phi$ .
- If the distortion is at most  $\beta = 4 - O(\epsilon)$ . Then
  - The spins are still well-defined
  - Neighborly gear/chains have opposite spin
  - Hence an 1-in-3 assignment for  $\phi$  if well-defined

# Summary

- Inapproximability results for planar bijection problem.
- Inapproximability for injection problem requires significantly different ideas.

## Open Problems:

- Tighten the approximation gap, i.e., values of best constants  $\alpha$  and  $\beta$ .
- Approximability when distortion  $\approx 1 + \epsilon$ .
- Is there an efficient algorithm when the optimal distortion is at most  $1 + \epsilon$  for  $\mathbb{R}^2$ , similar to [KRS04, CMO<sup>+</sup>08].

Thank You

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