

The Traveling Salesman Problem Under Squared Euclidean Distances

Mark de Berg Fred van Nijnatten Gerhard Woeginger

TU Eindhoven

René Sitters

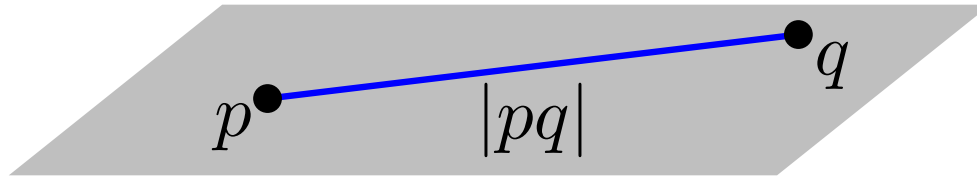
Vrije Universiteit Amsterdam

Alexander Wolff

Universität Würzburg

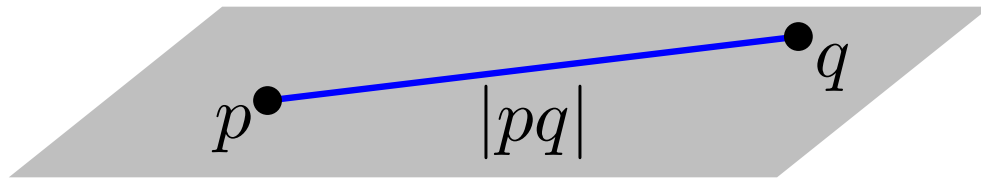
What's the Problem?

Notation. For points $p = (p_1, \dots, p_d), q = (q_1, \dots, q_d) \in \mathbb{R}^d$,
denote by $|pq| = \sqrt{\sum_{i=1}^d (p_i - q_i)^2}$ their
Euclidean distance.



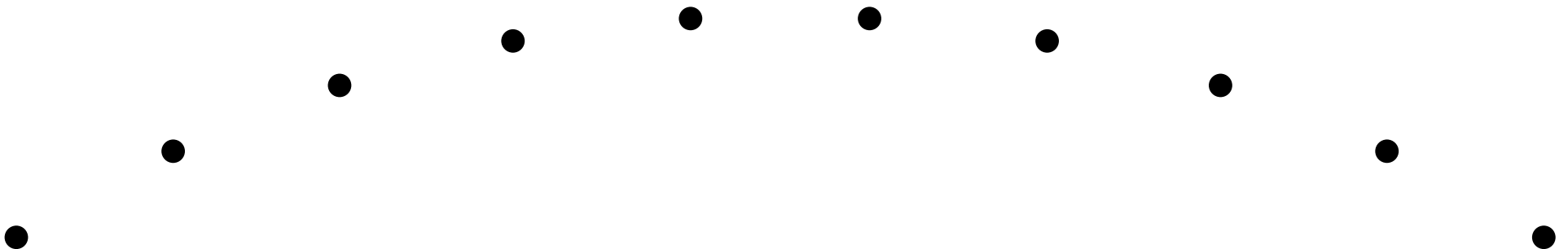
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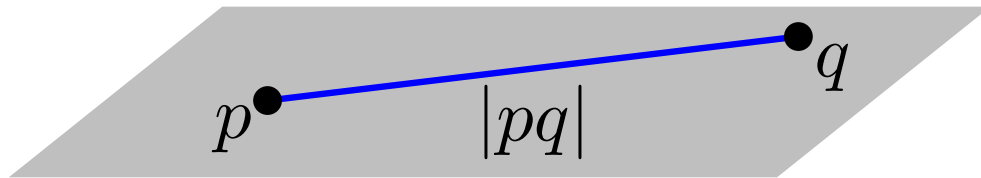
Problem. *Euclidean TSP*

Given a finite set $S \subset \mathbb{R}^d$, find a tour π through all points in S such that π has minimum length among all tours through S w.r.t. $|\cdot|$.



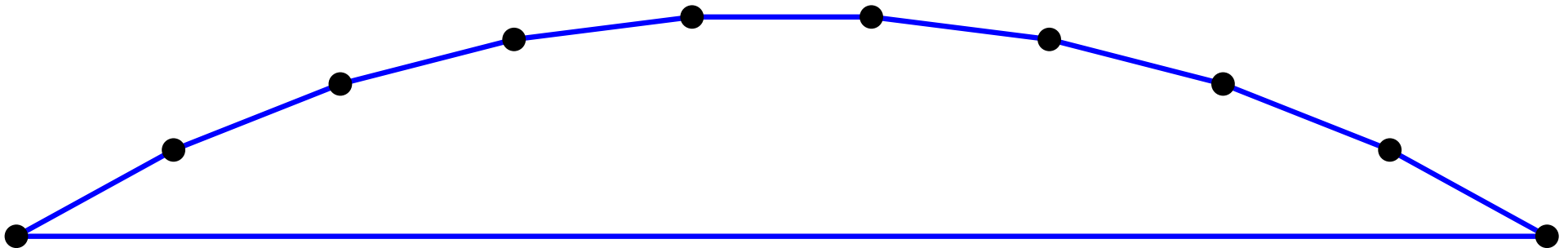
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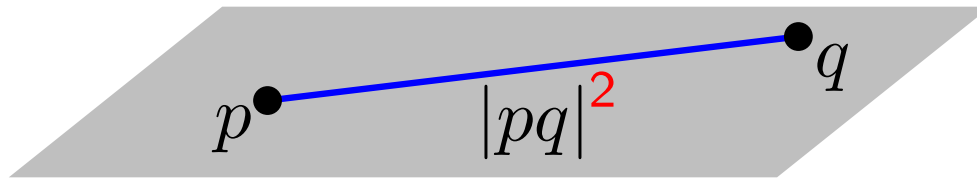
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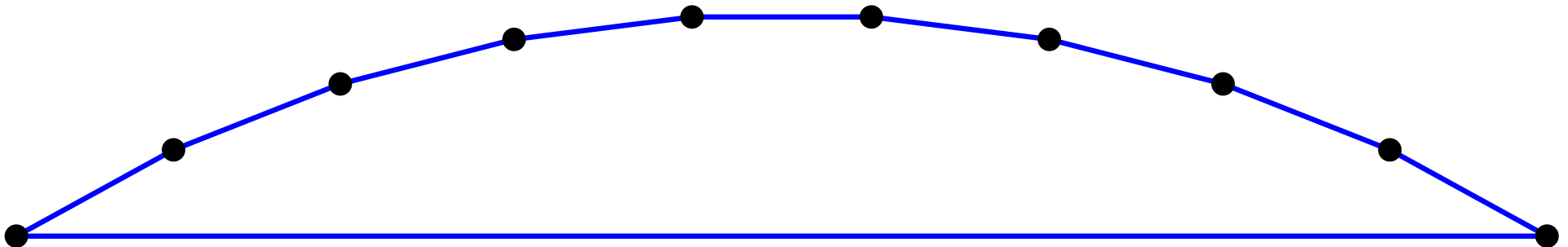
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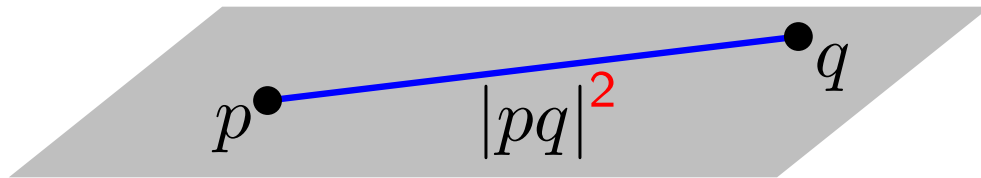
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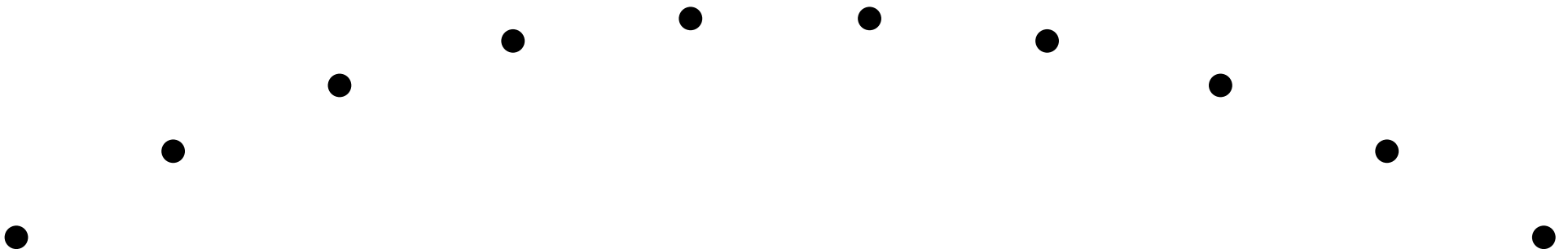
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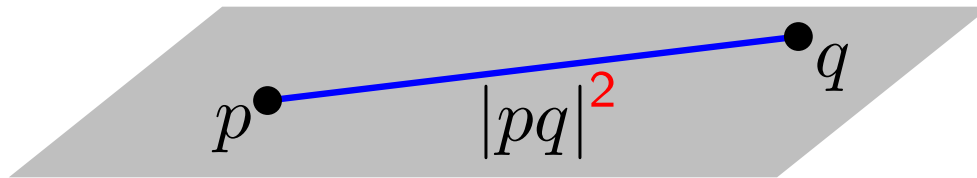
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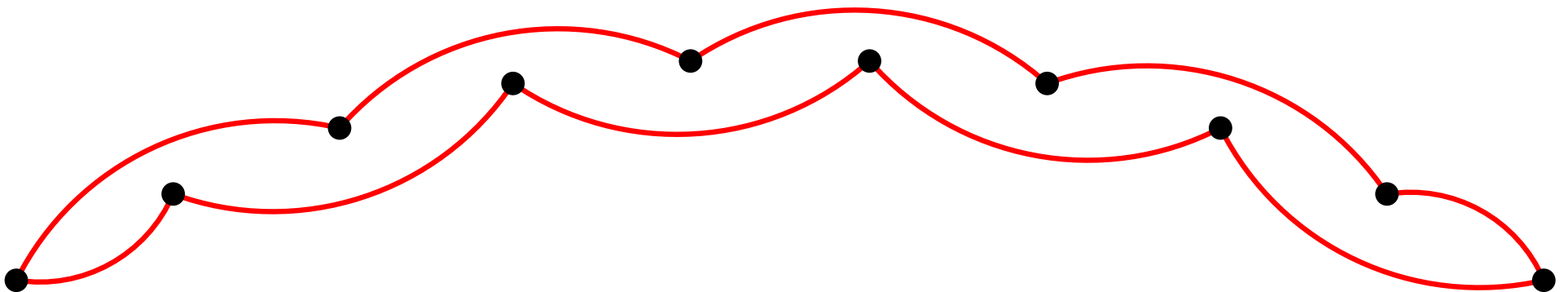
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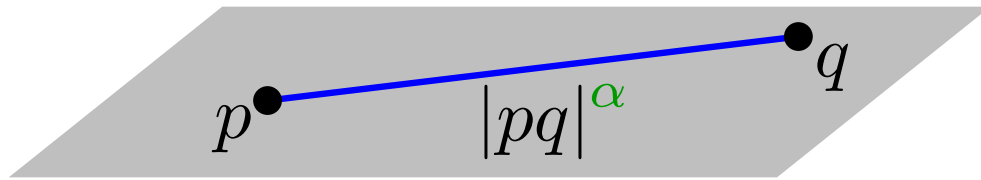
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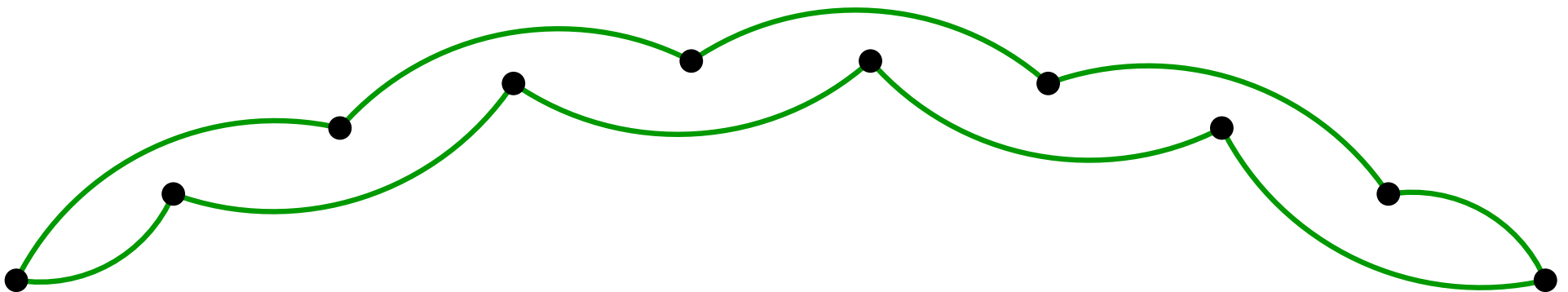
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Notation. For points $p = (p_1, \dots, p_d), q = (q_1, \dots, q_d) \in \mathbb{R}^d$, denote by $|pq|^\alpha = \sqrt{\sum_{i=1}^d (p_i - q_i)^2}^\alpha$ their *power- α Euclidean distance*.



Problem. ~~Euclidean~~ $TSP(d, \alpha)$

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The Metric/Euclidean Case ($\alpha = 1$)

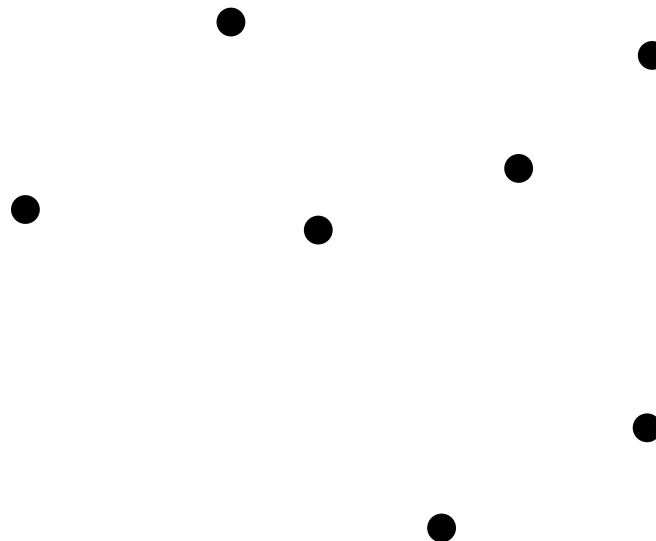
Theorem. [folklore]

The MST yields a 2-approximation for metric TSP.

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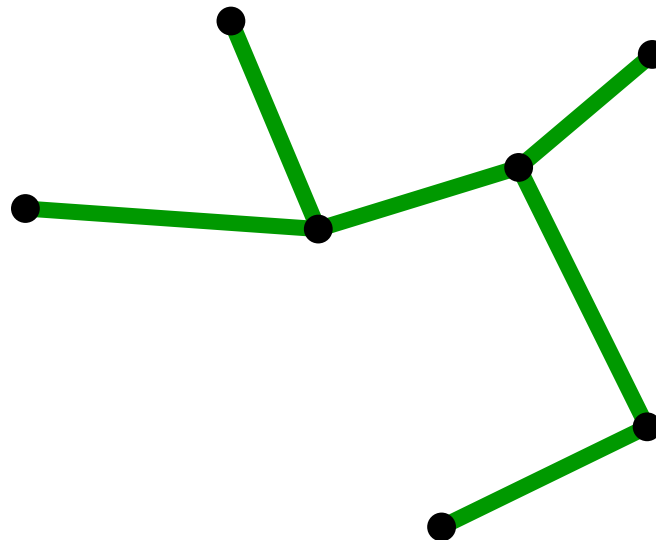
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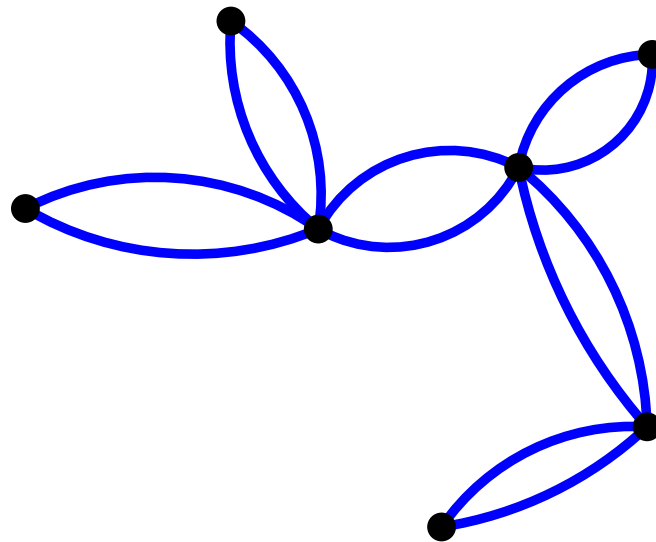
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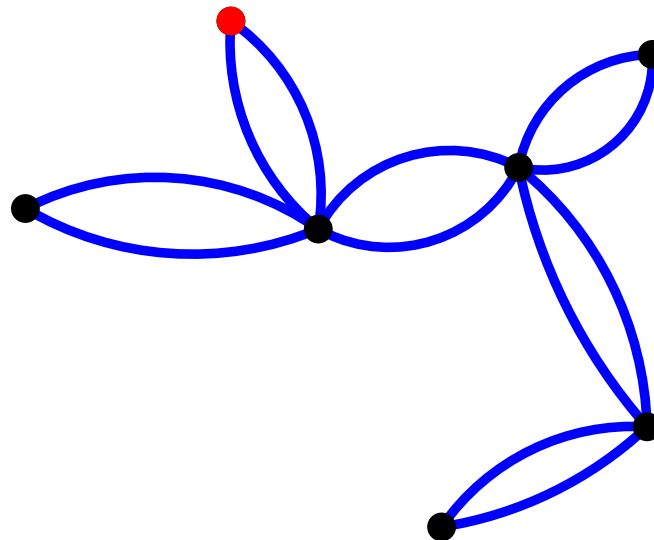
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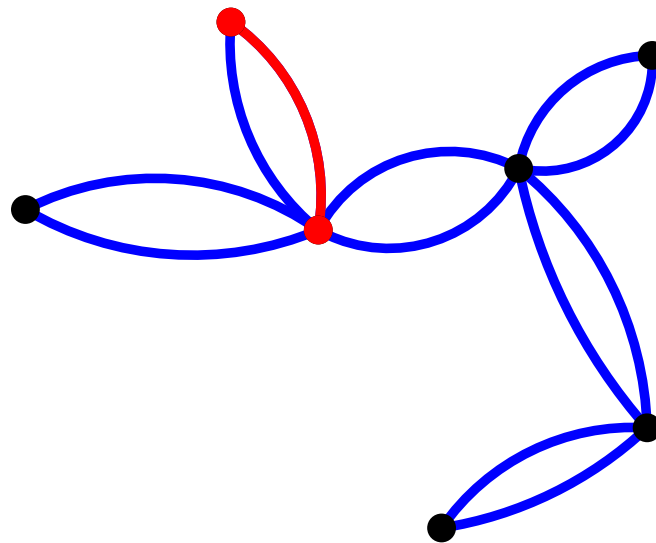
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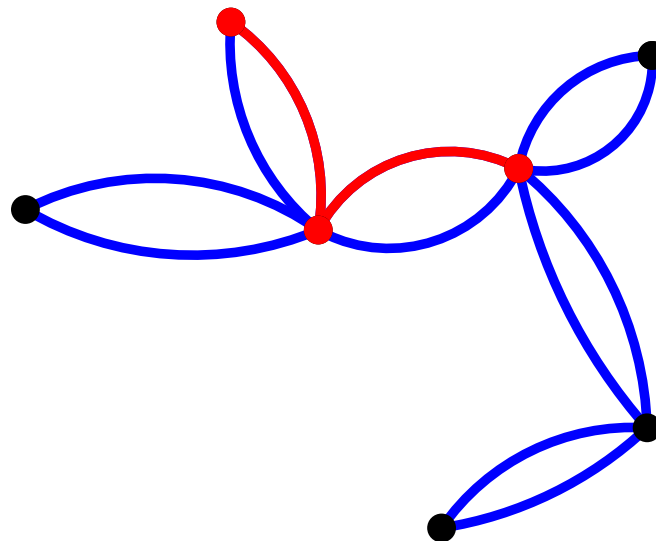
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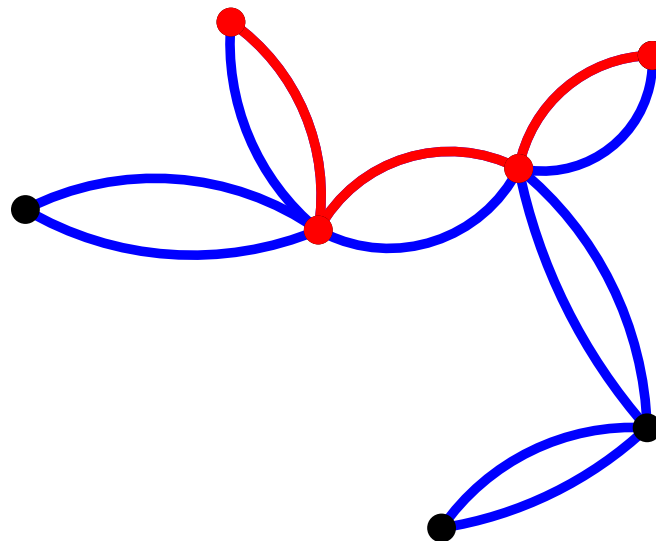
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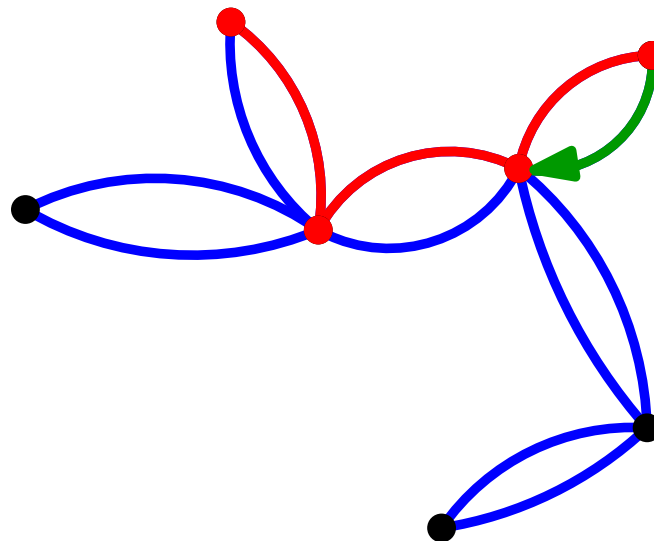
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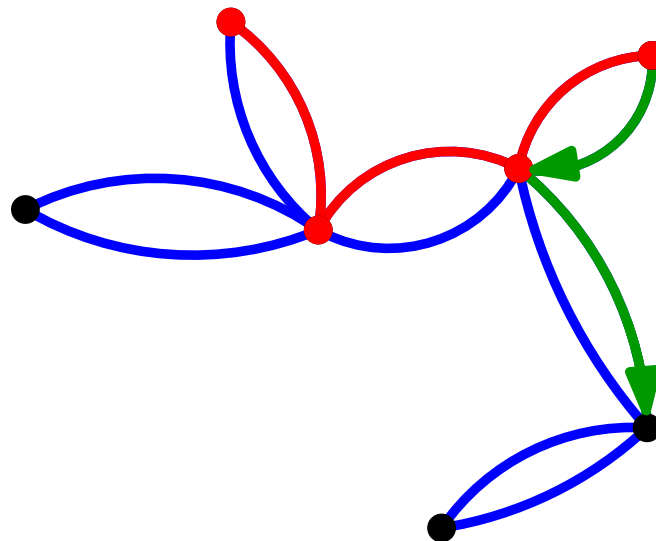
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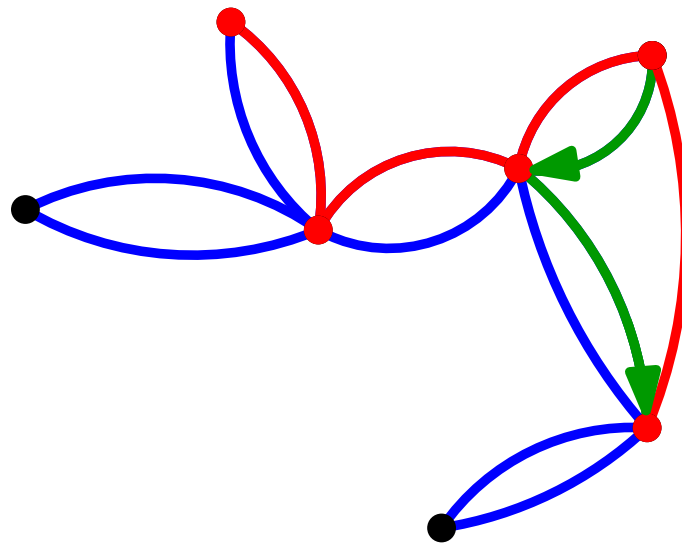
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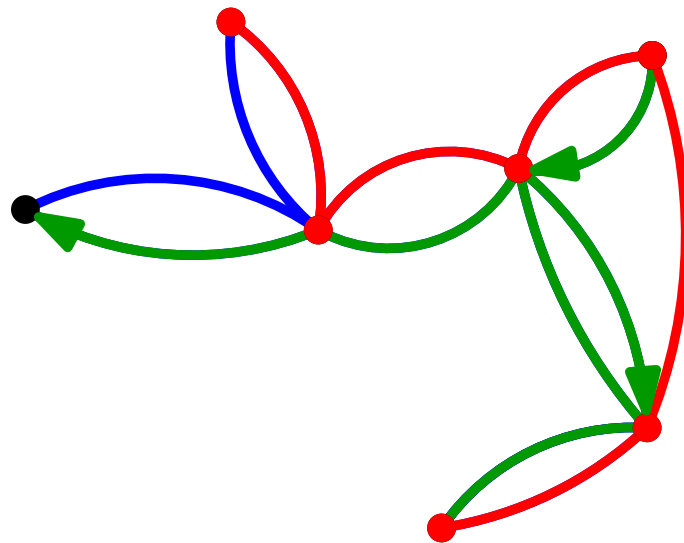
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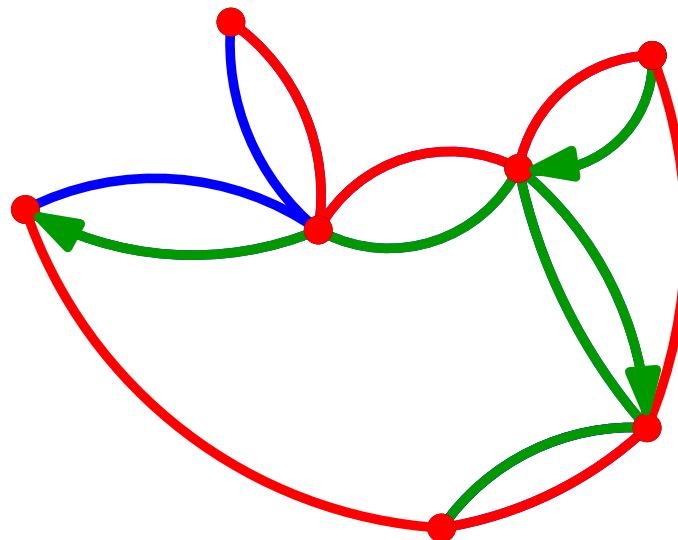
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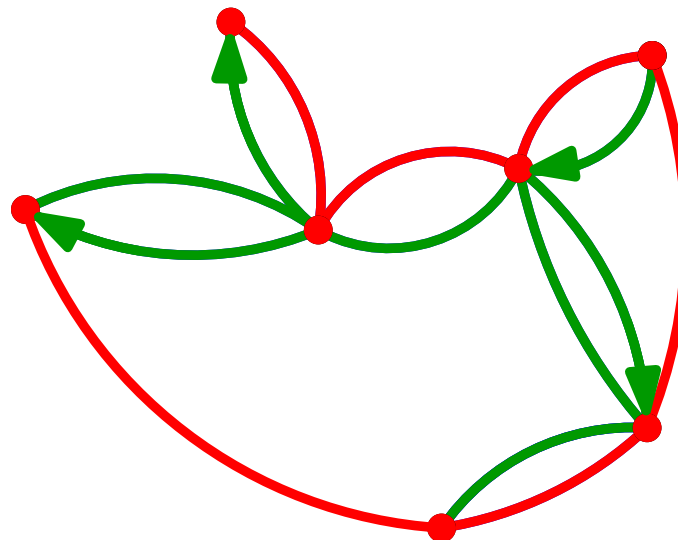
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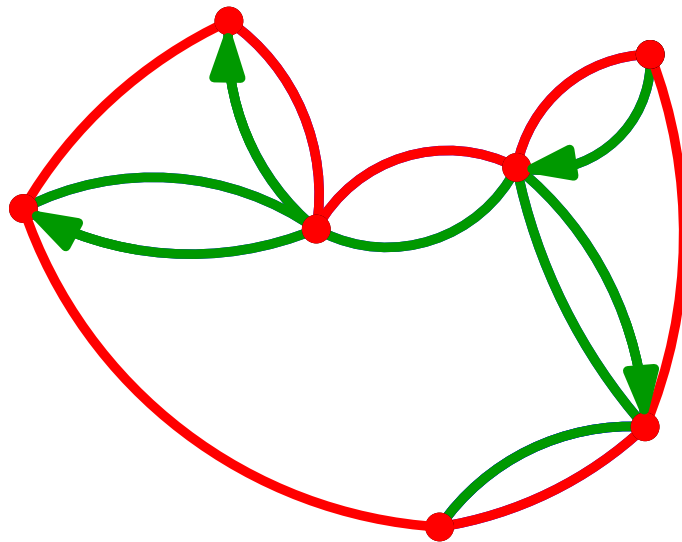
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Theorem. [Arora'96, Mitchell'96, RaoSmith'98]

Euclidean TSP admits a PTAS for any fixed $d \geq 1$.

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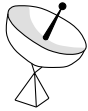
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Euclidean TSP admits a PTAS for any fixed $d \geq 1$.

But what about $\text{TSP}(d, \alpha)$
for $\alpha \neq 1$?

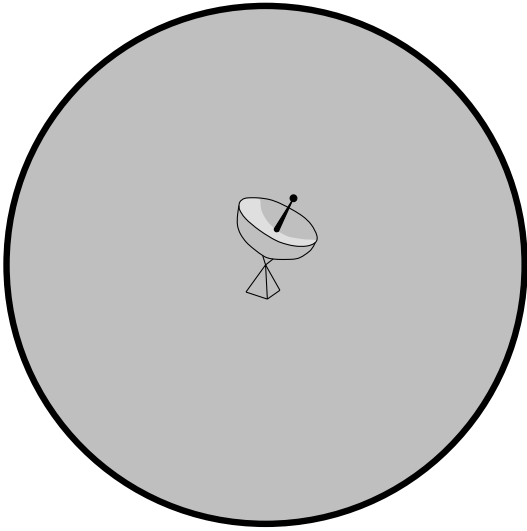
Motivation

1. Range assignment for wireless networks



Motivation

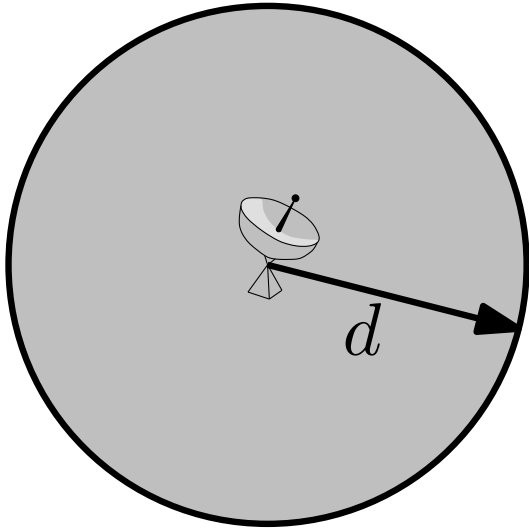
1. Range assignment for wireless networks



- transmission range depends on power

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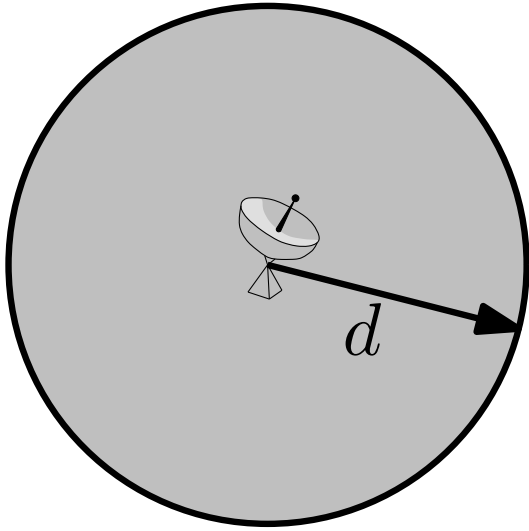
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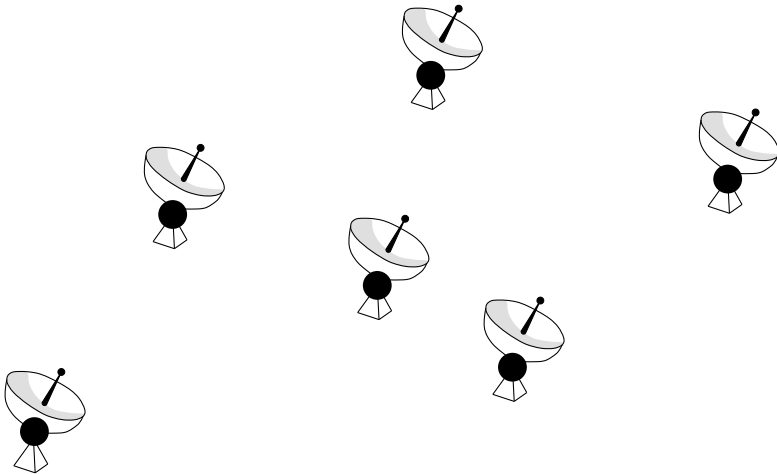
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for some $\alpha \in [2, 6]$
(“distance-power gradient”)

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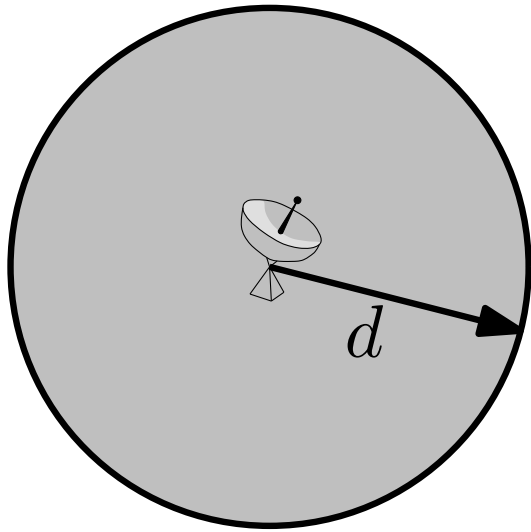


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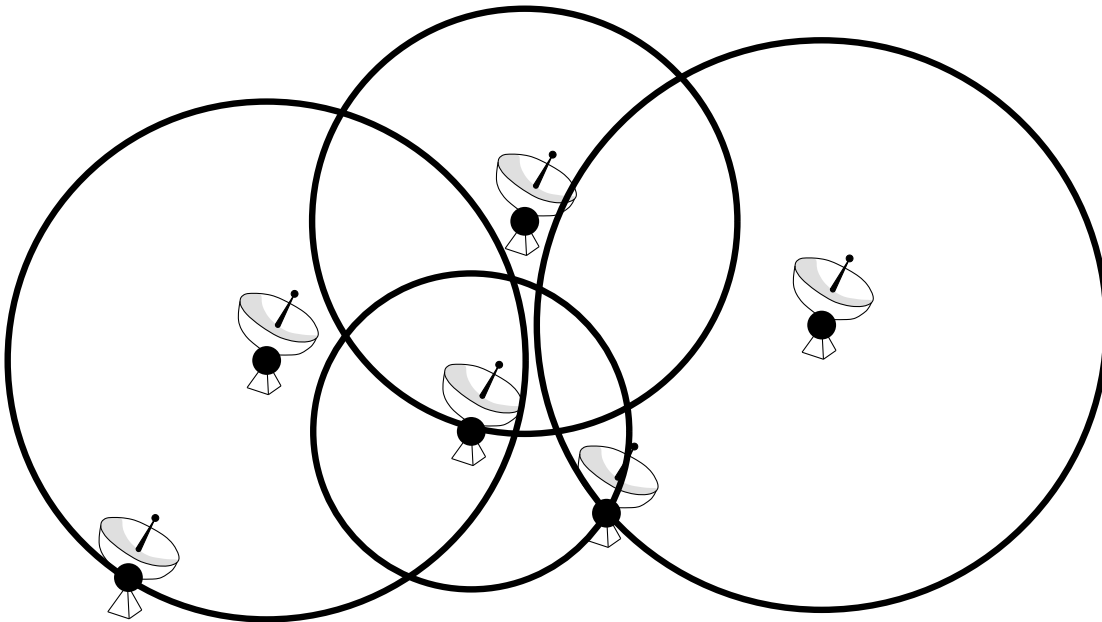


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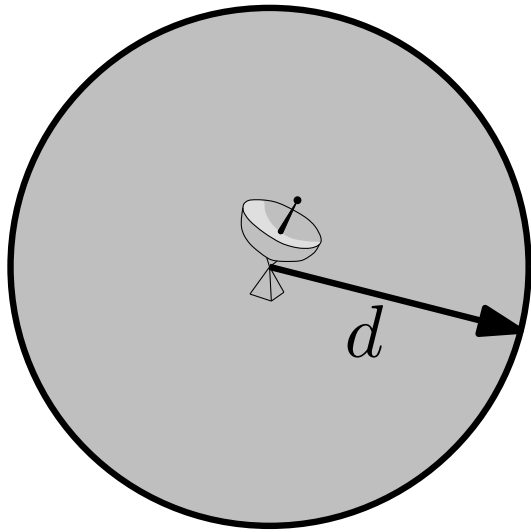


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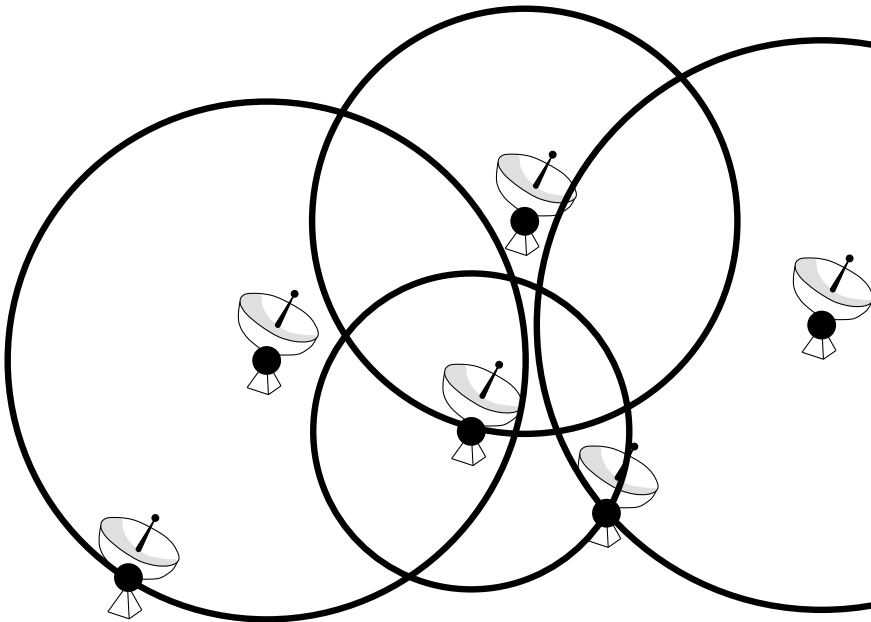
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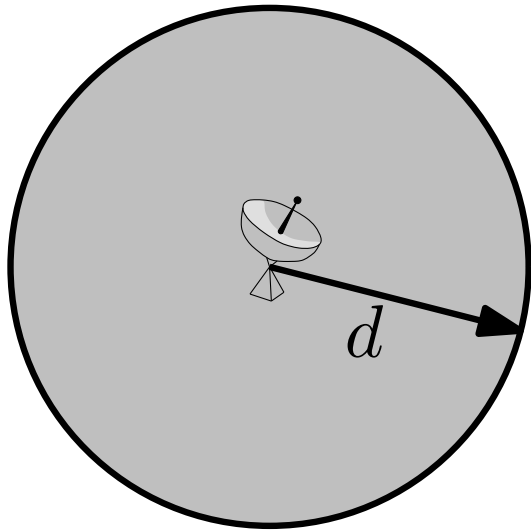
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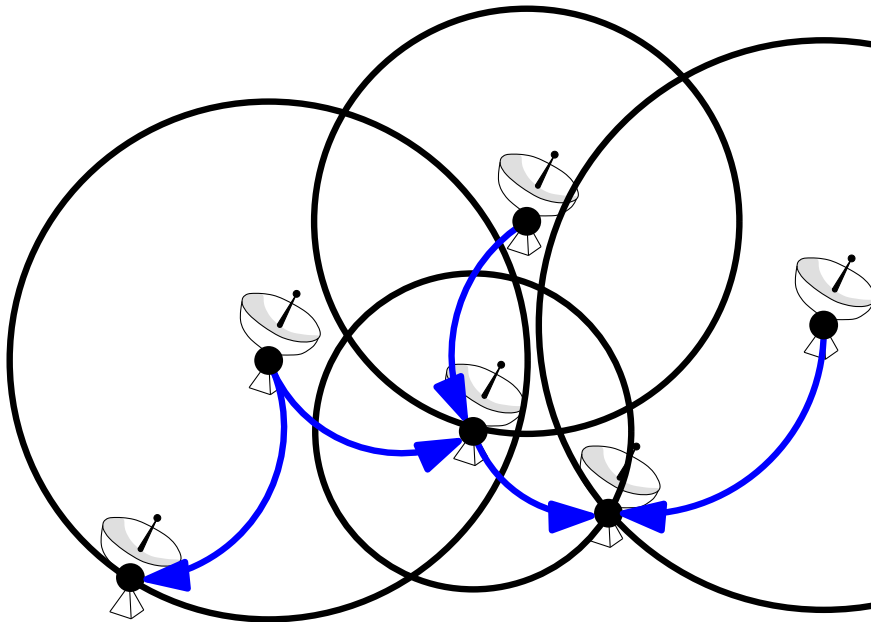


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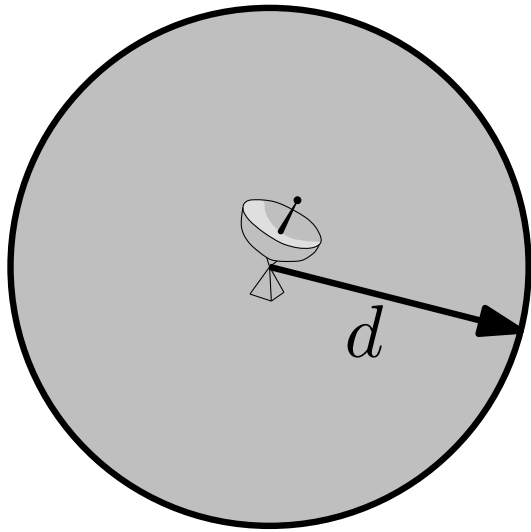
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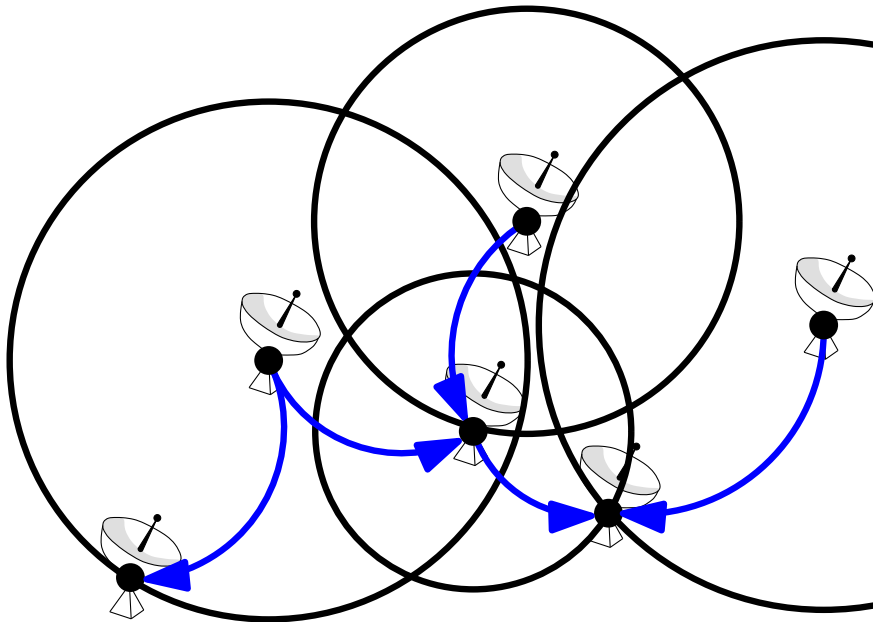
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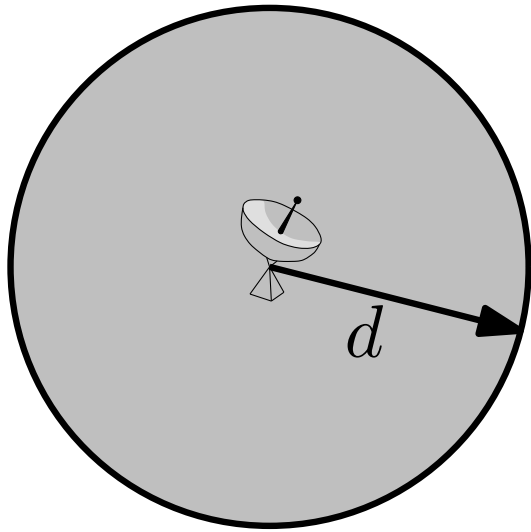
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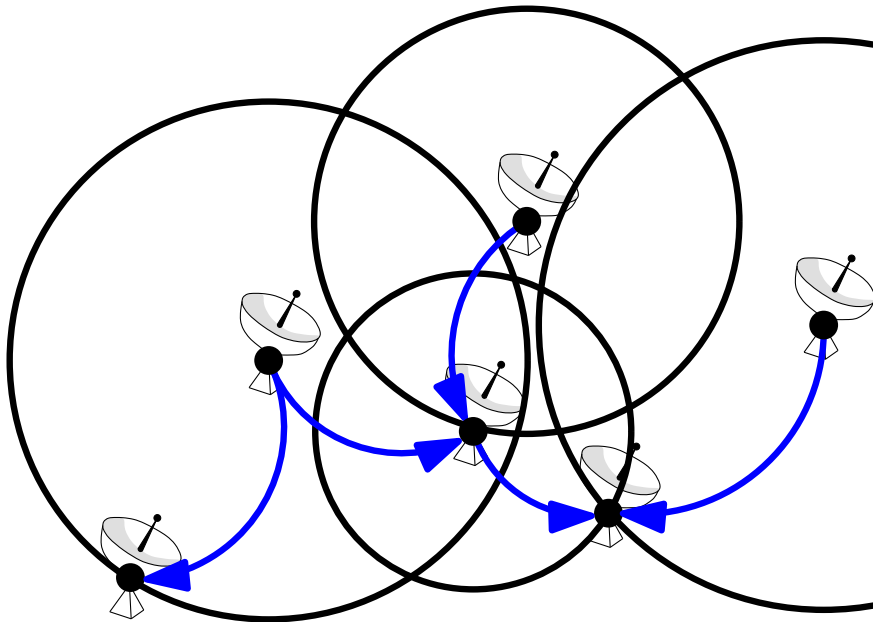
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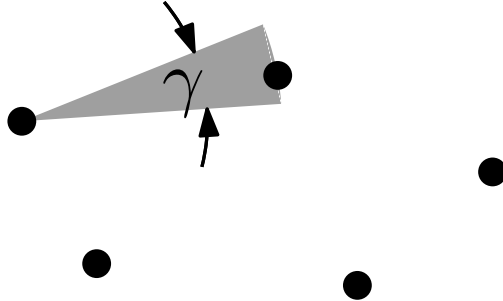
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- range assignment ρ induces
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 - is strongly connected
 - contains broadcast tree
 - *contains tour* [Funke... '08]

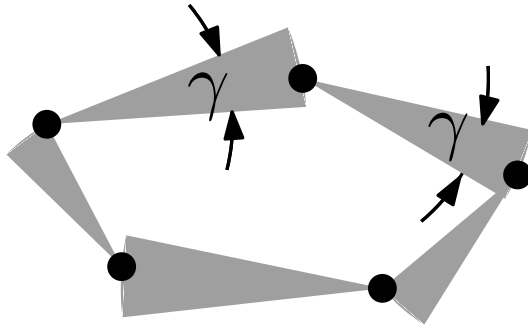
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2. Directional antennas with circular sectors [Caragiannis...'08]



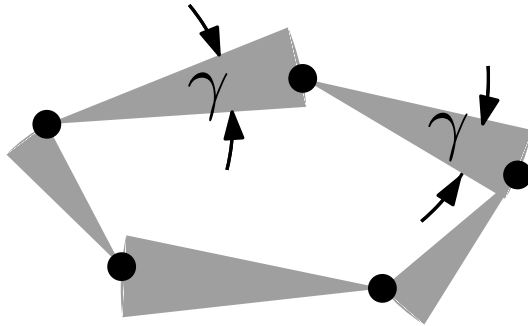
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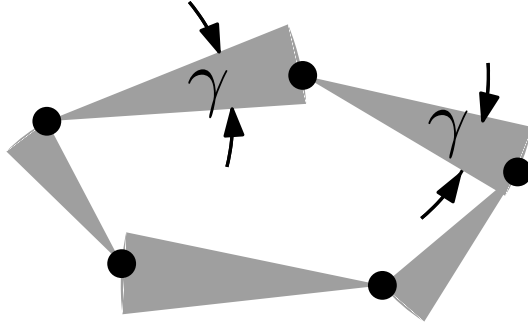
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G_ρ strongly connected

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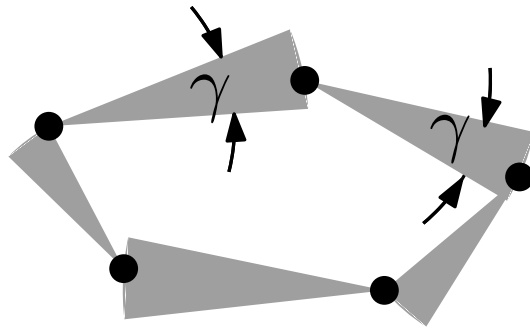
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G_ρ strongly connected $\xrightarrow{\gamma \rightarrow 0}$

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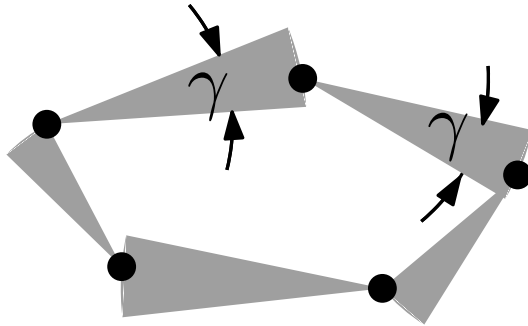
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G_ρ strongly connected $\xrightarrow{\gamma \rightarrow 0}$ G_ρ tour

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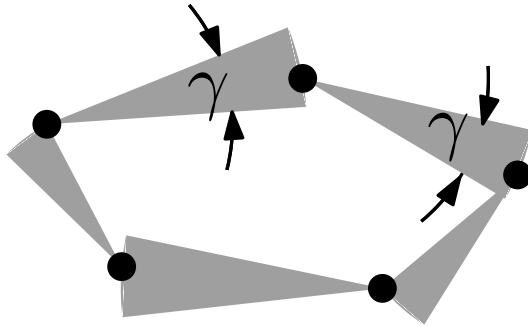
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3. Complexity

Are things becoming simpler or harder?

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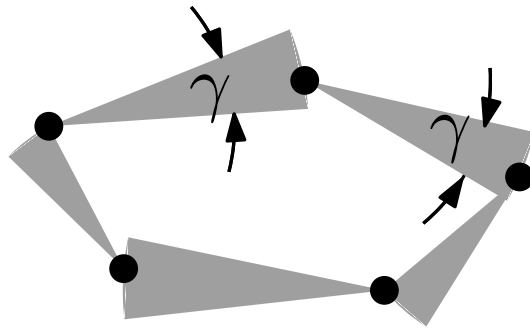
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Is Arora's PTAS for Euclidean TSP a “lucky coincidence”?

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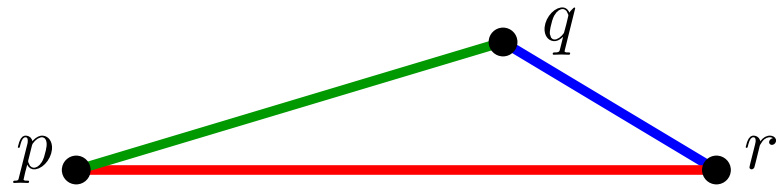
Is Arora's PTAS for Euclidean TSP a “lucky coincidence”?

If it is, how well can we approximate, say, $\text{TSP}(2, 2)$?

Previous Work

Definition. $\text{dist}(\cdot, \cdot)$ fulfills the τ -relaxed triangle inequality if any three points p, q, r satisfy

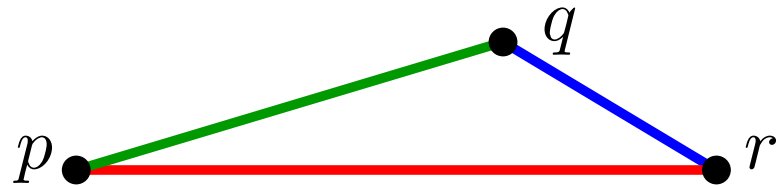
$$\text{dist}(p, r) \leq \tau \cdot (\text{dist}(p, q) + \text{dist}(q, r)).$$



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Lemma.

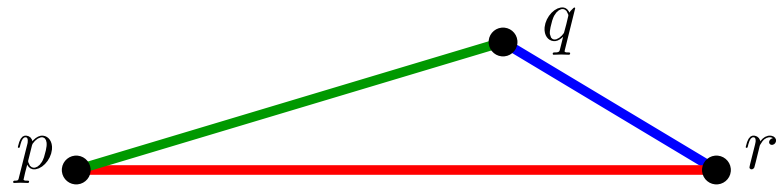
[Funke... '08]

$|\cdot|^2$ fulfills the 2-relaxed triangle inequality.

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Lemma.

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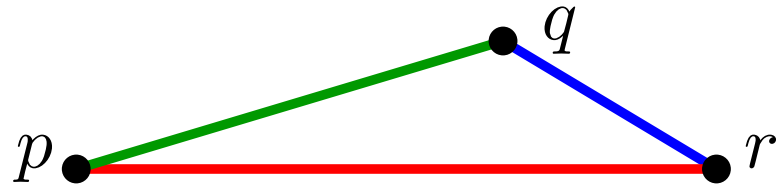
For $\alpha \geq 1$,

$|\cdot|^\alpha$ fulfills the $2^{\alpha-1}$ -relaxed triangle inequality.

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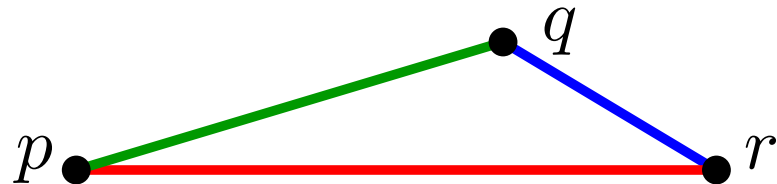
Lemma. [Funke... '08] For $\alpha \geq 1$,
 $|\cdot|^\alpha$ fulfills the $2^{\alpha-1}$ -relaxed triangle inequality.

Good news. Can apply algorithms for Δ_τ -TSP to $\text{TSP}(\cdot, \alpha)$!

Previous Work

Definition. $\text{dist}(\cdot, \cdot)$ fulfills the τ -relaxed triangle inequality if any three points p, q, r satisfy

$$\text{dist}(p, r) \leq \tau \cdot (\text{dist}(p, q) + \text{dist}(q, r)).$$



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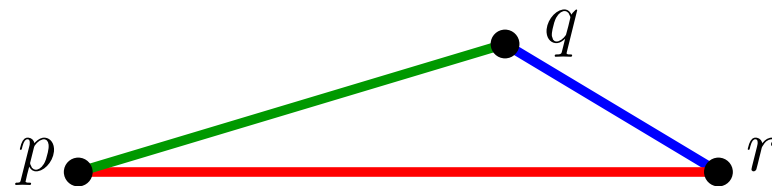
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Δ_τ	$\text{TSP}(\cdot, \alpha)$	
$\tau^2 + \tau$	$4^{\alpha-1} + 2^{\alpha-1}$	[Andreae'01]
4τ	$2^{\alpha+1}$	[BenderChekuri'00]

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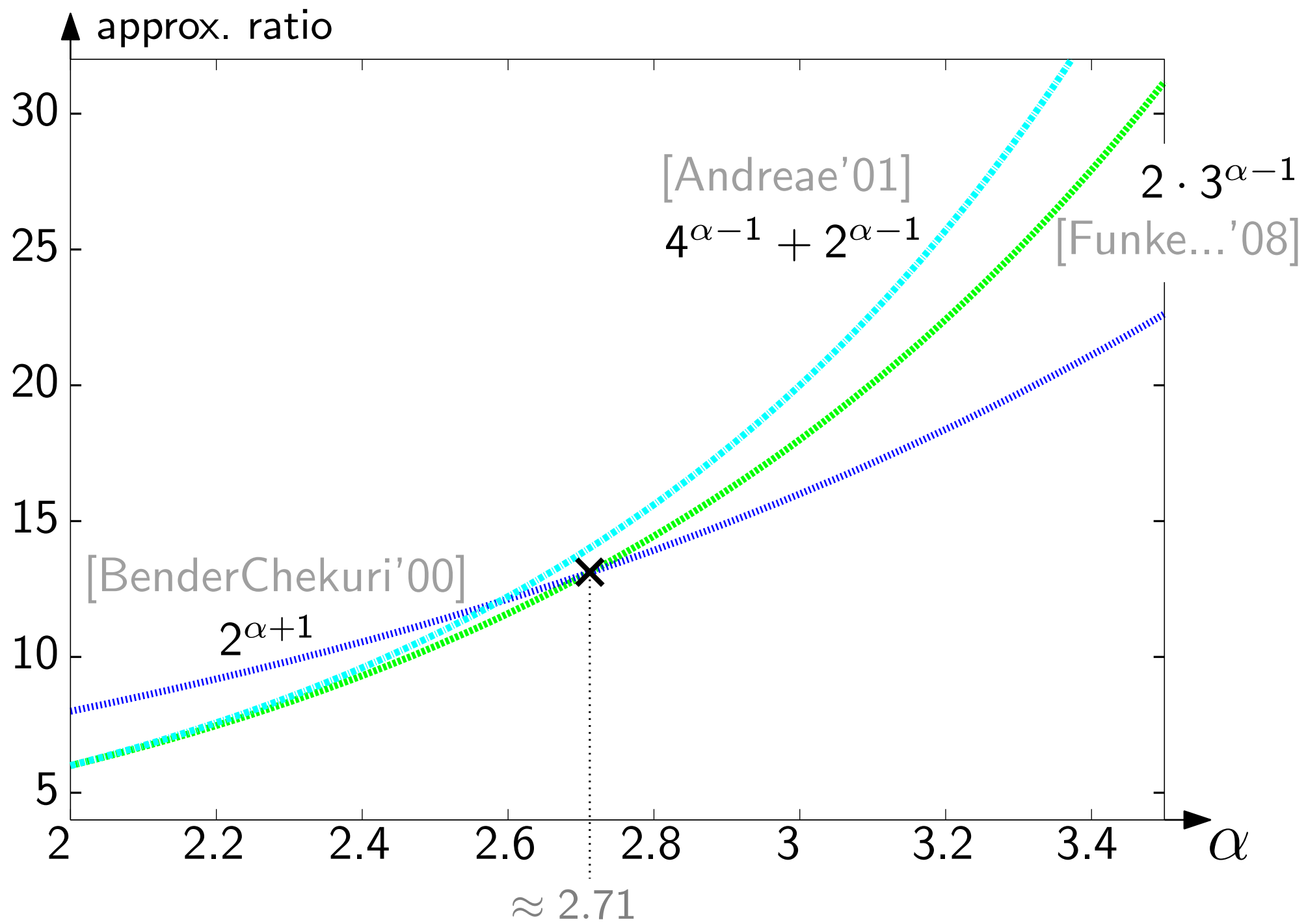
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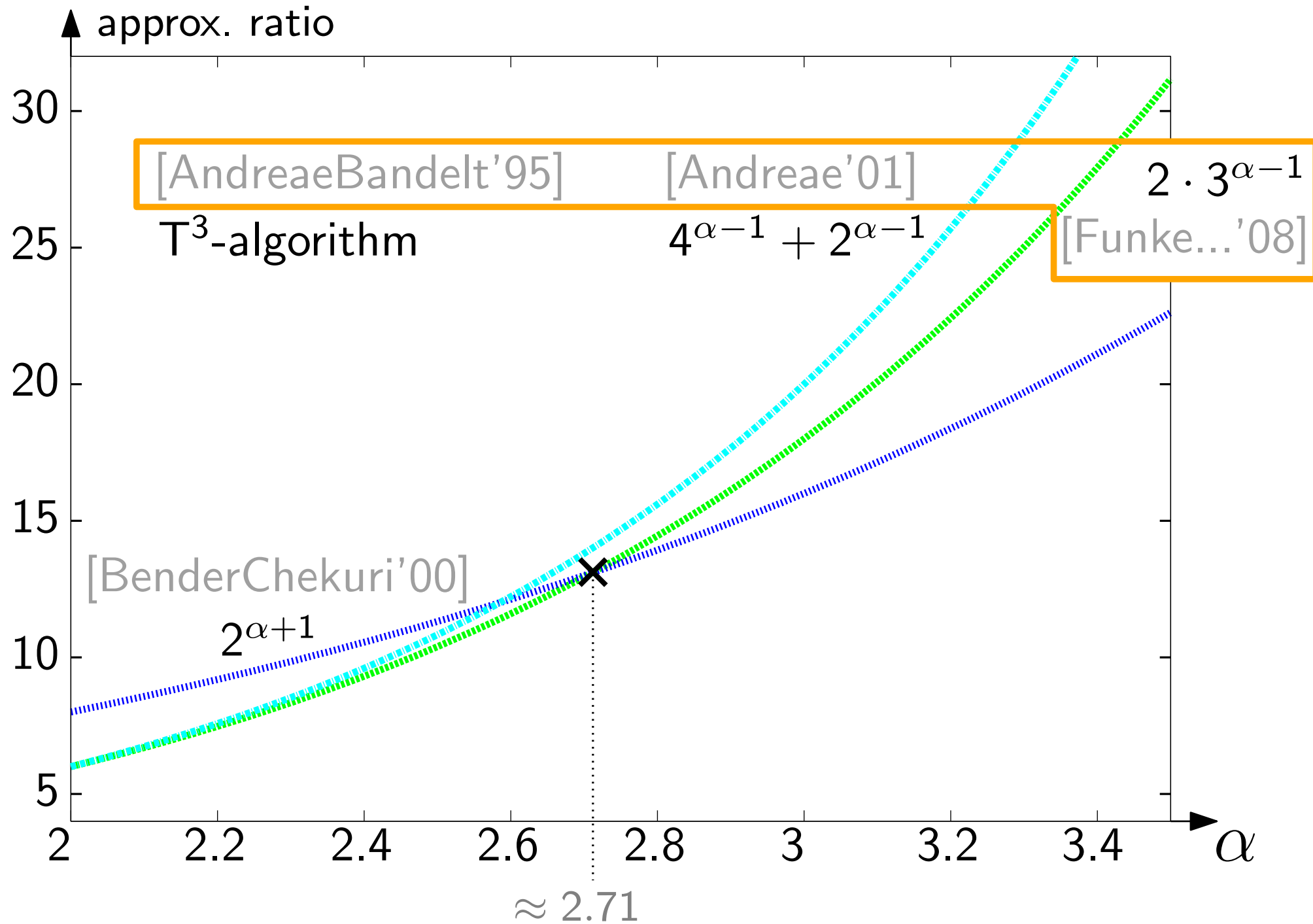
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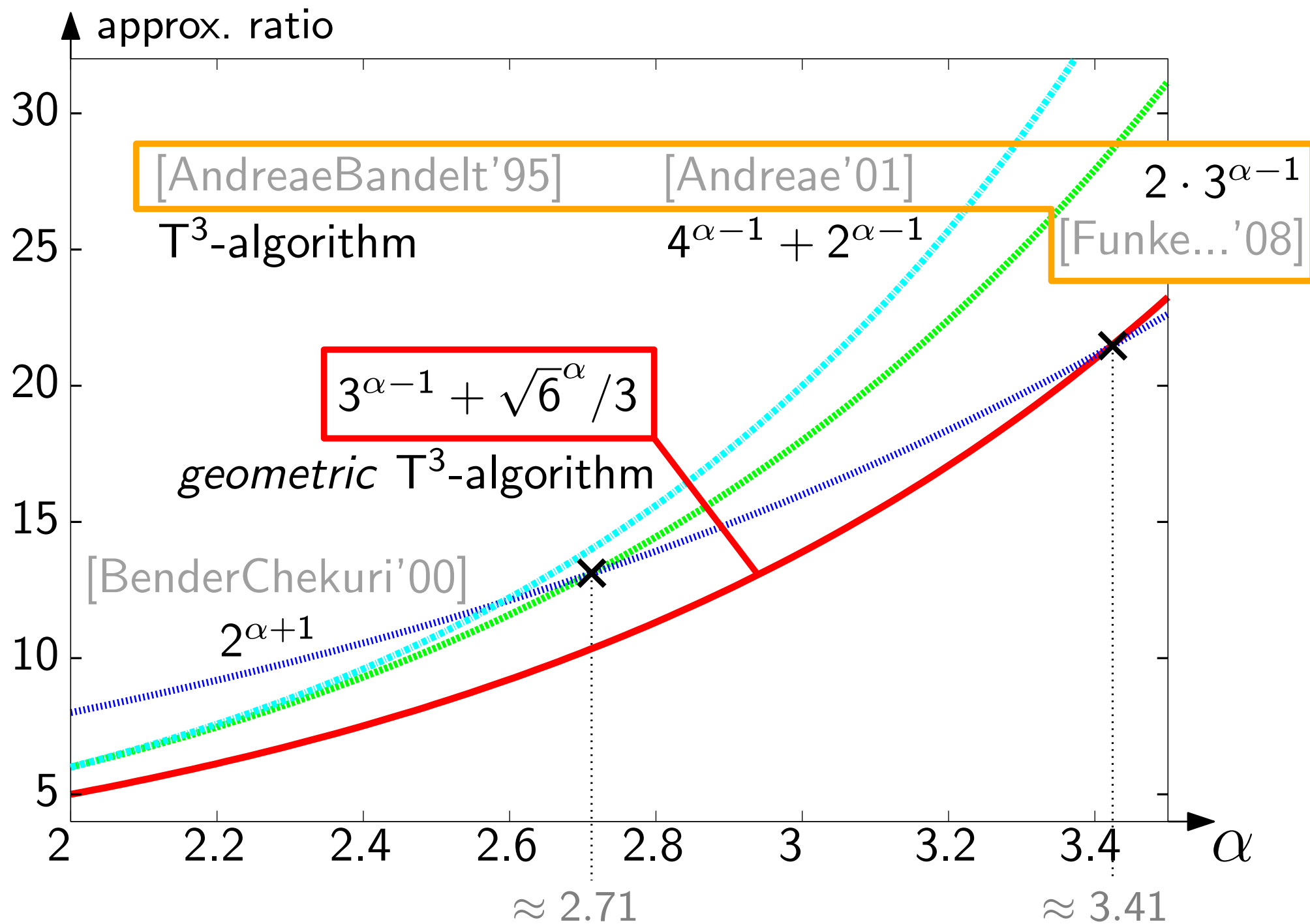
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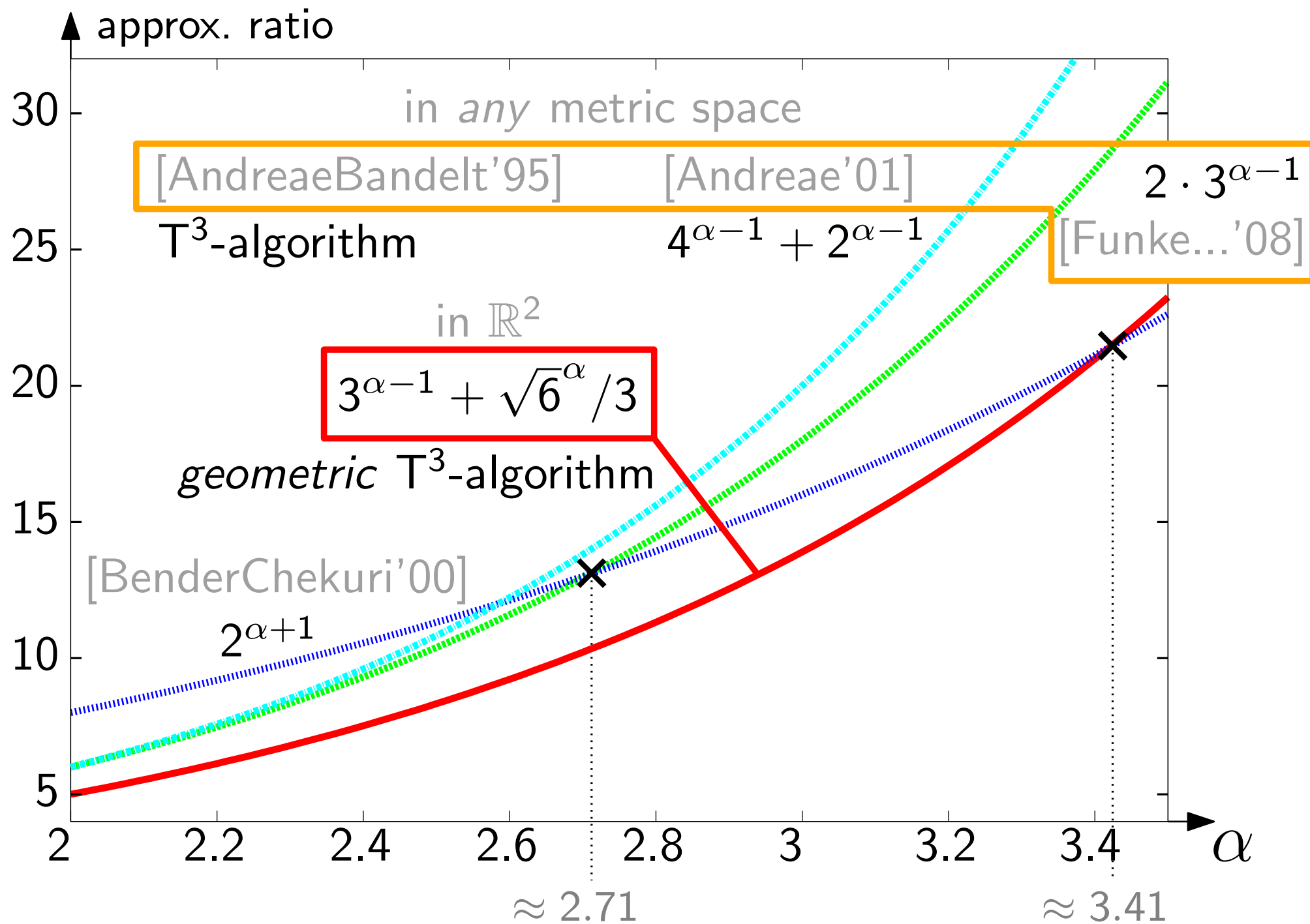
Our Results



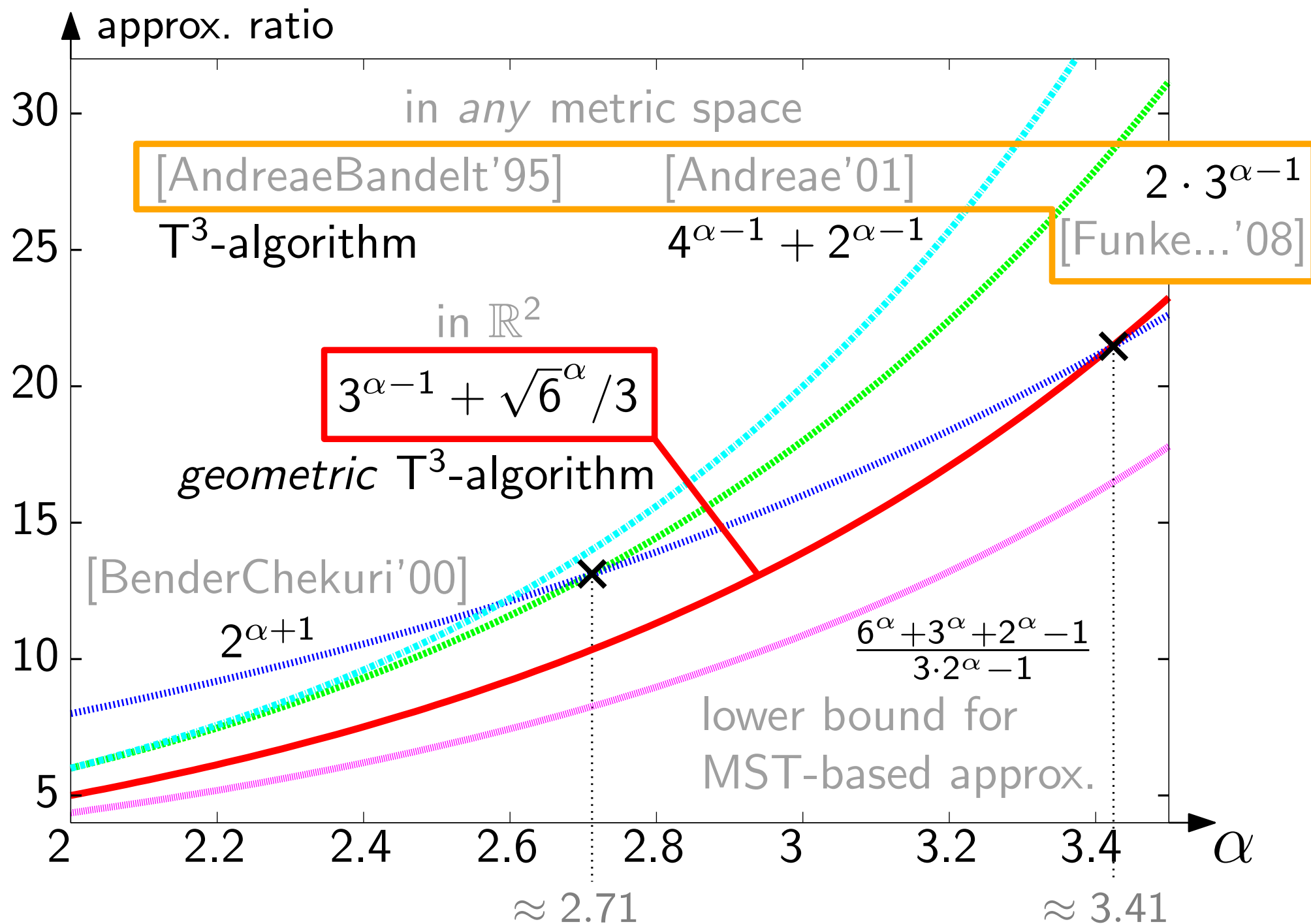
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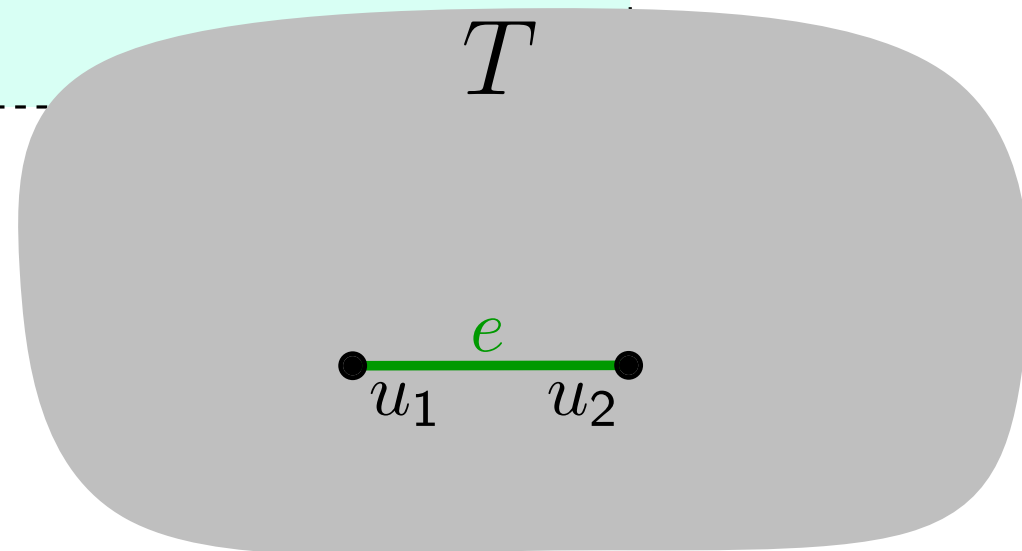
Our Results



The T^3 -Algorithm

[Sekanina'60, AndreaeBandelt'95]

CYCLEINCUBE(T , $e = u_1u_2$)



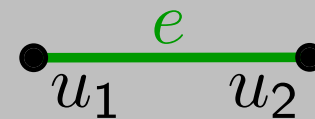
The T^3 -Algorithm

[Sekanina'60, AndreaeBandelt'95]

CYCLEINCUBE(T , $e = u_1u_2$)

Take MST of given point set!

T



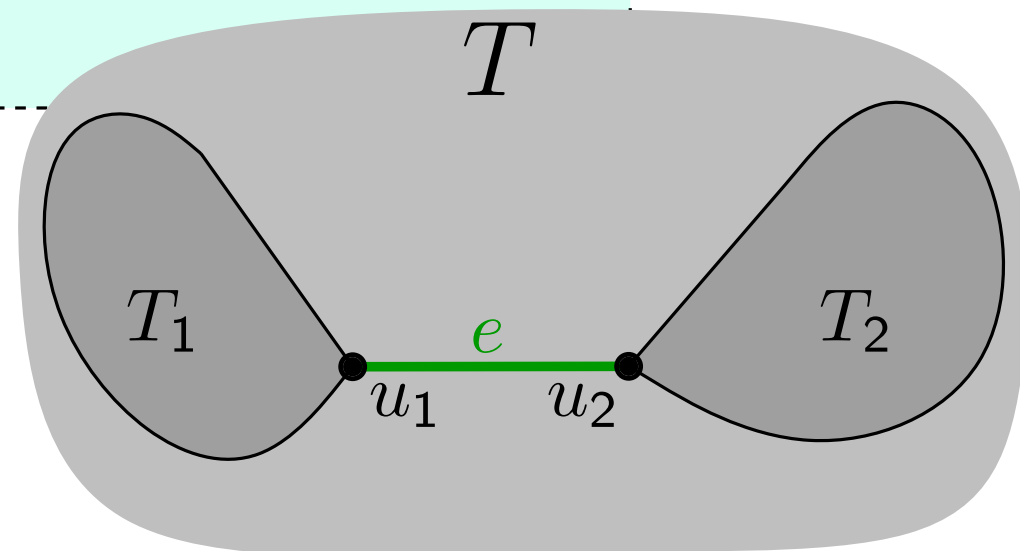
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[Sekanina'60, AndreaeBandelt'95]

CYCLEINCUBE(T , $e = u_1u_2$)

for $i \leftarrow 1$ **to** 2 **do**

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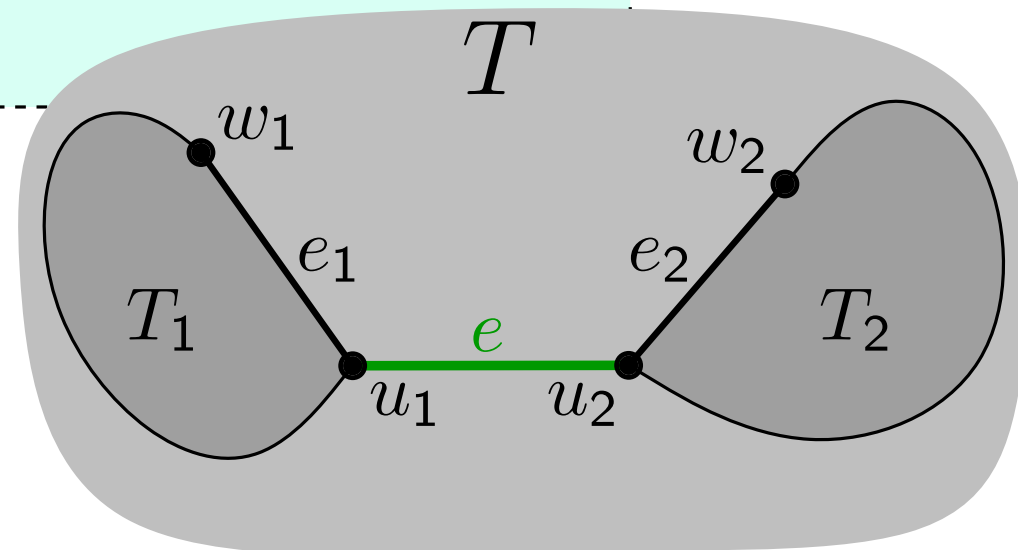
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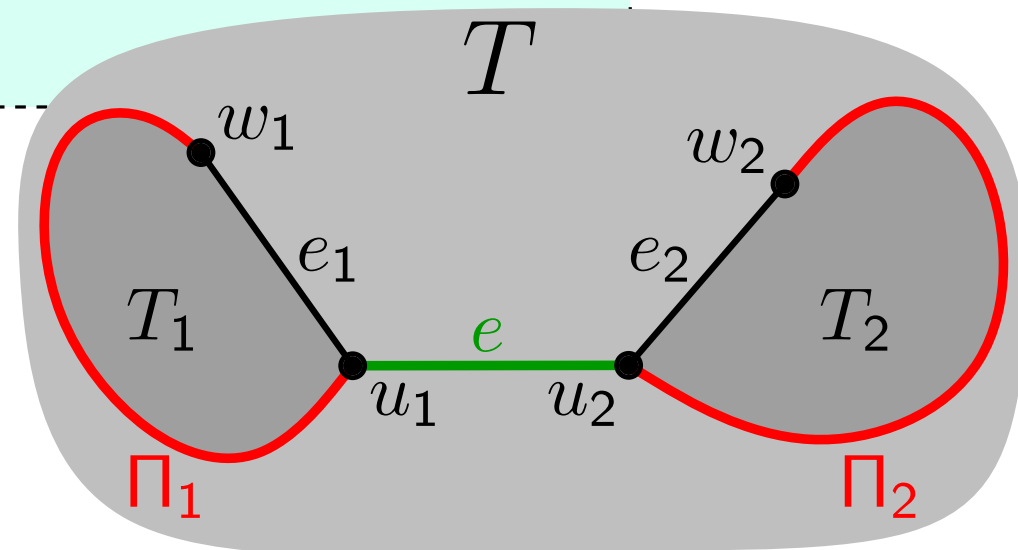
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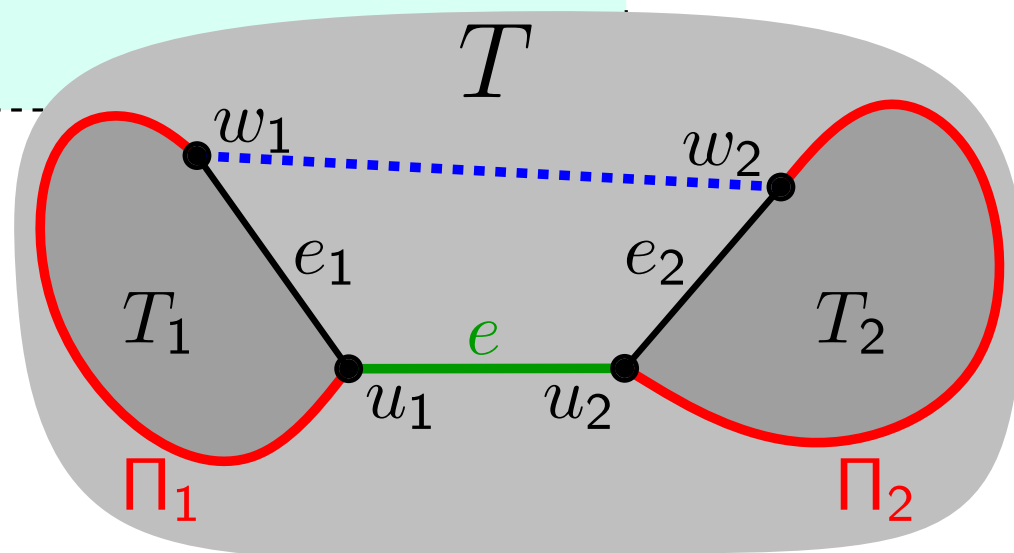
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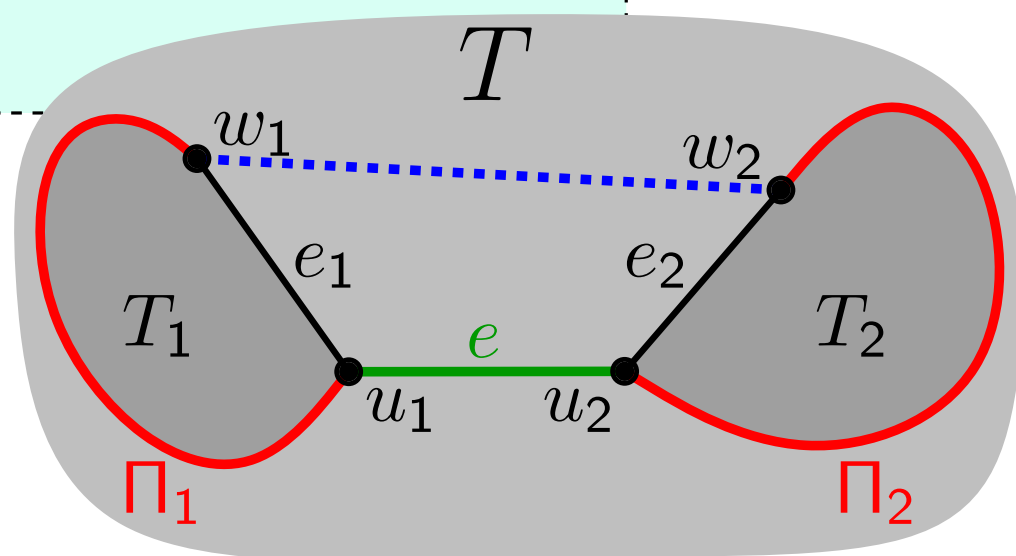
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3-shortcut



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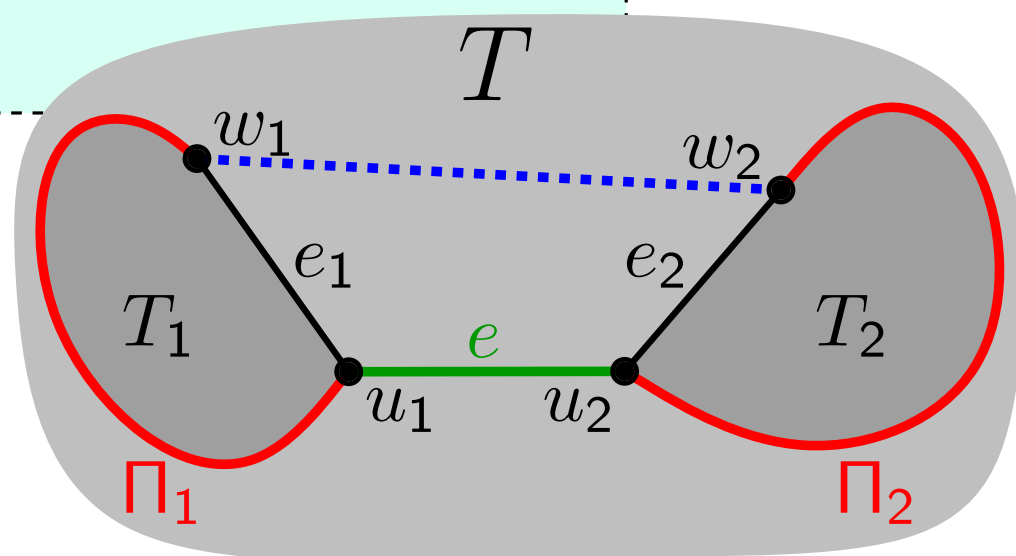
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③ shortcut



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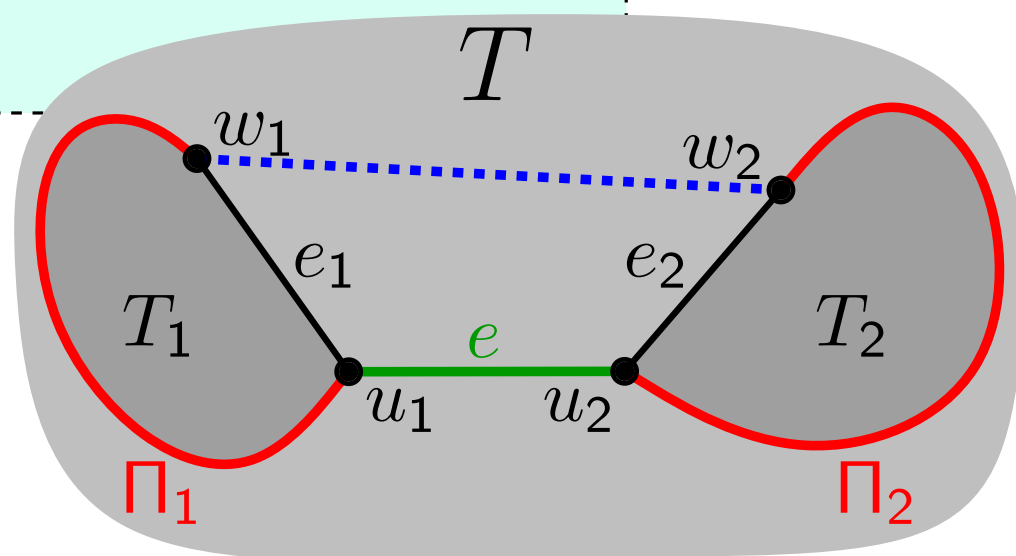
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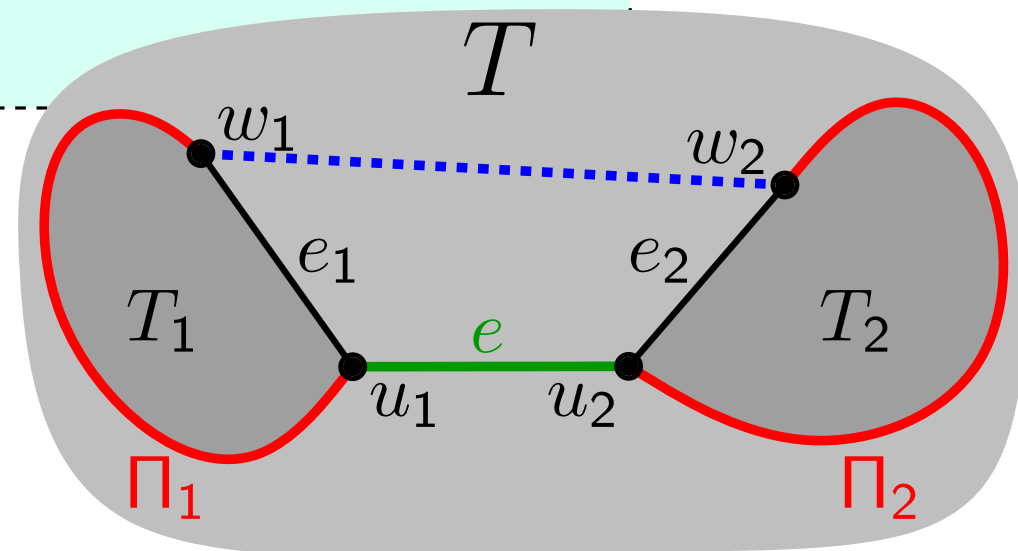
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(2- or) 3-*shortcut*



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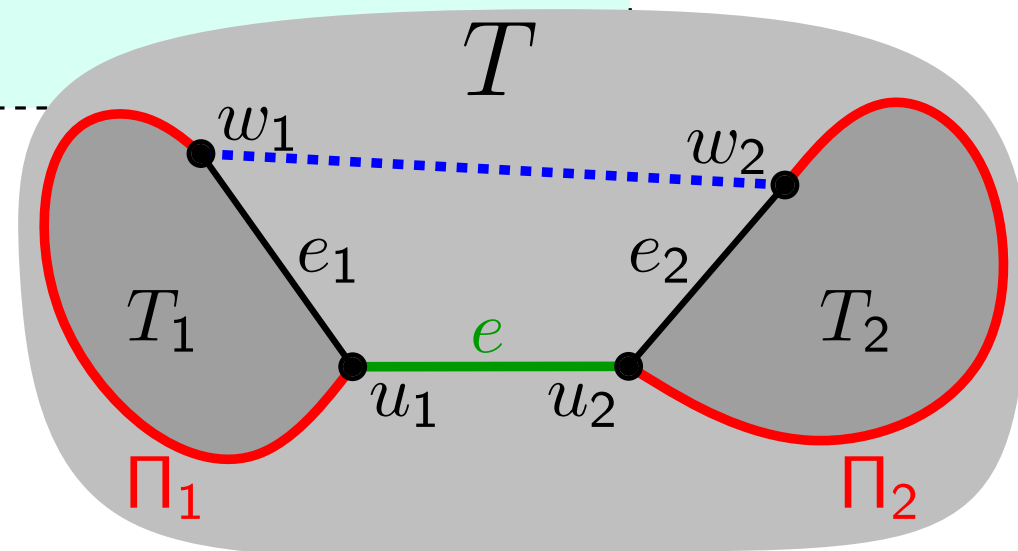
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(2- or) 3-*shortcut* — uses edges e, e_1 , and e_2



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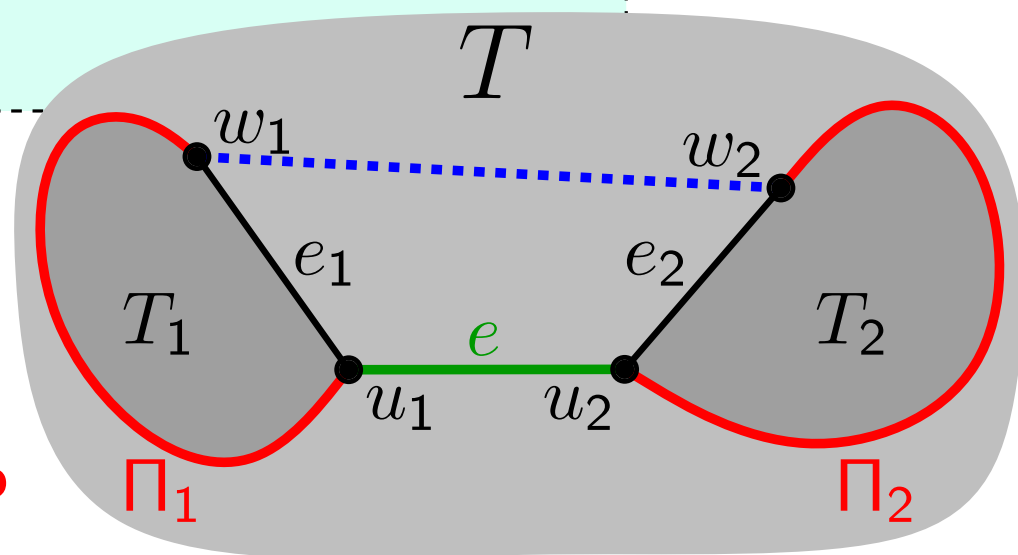
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Observation.

Every edge is used at most ...?



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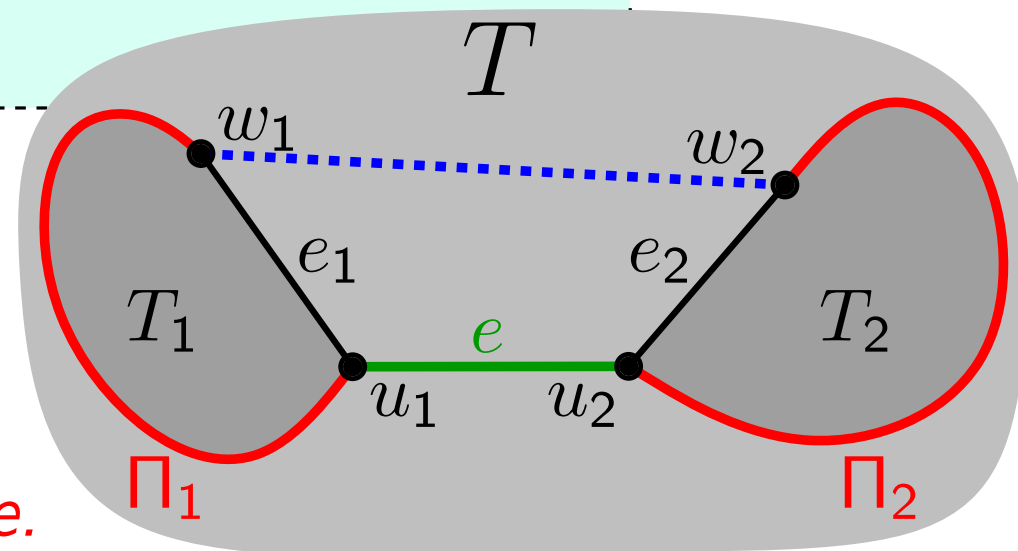
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Every edge is used at most *twice*.



Result #1

Observation. Every edge is used at most twice.

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Lemma. Let e be a 3-shortcut using a, b, c . Let $\alpha \geq 1$.
Then $|e|^\alpha \leq 3^{\alpha-1} (|a|^\alpha + |b|^\alpha + |c|^\alpha)$.

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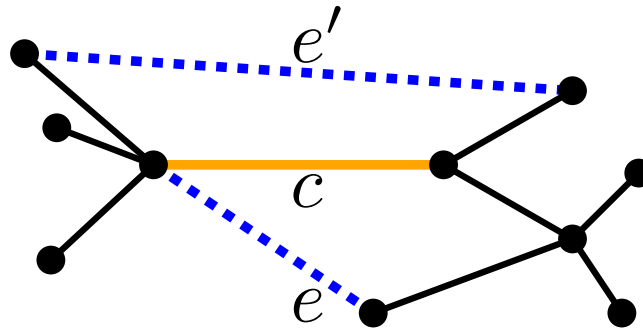
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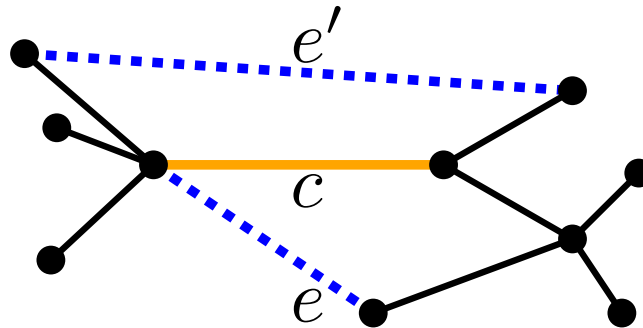
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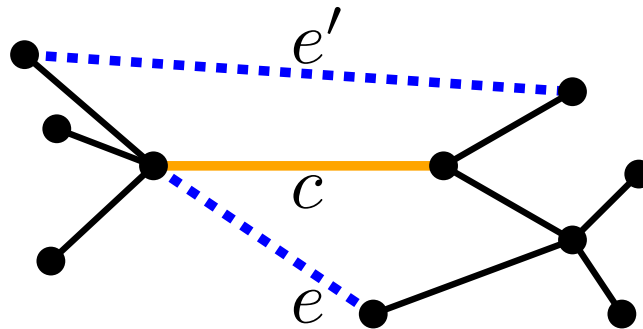
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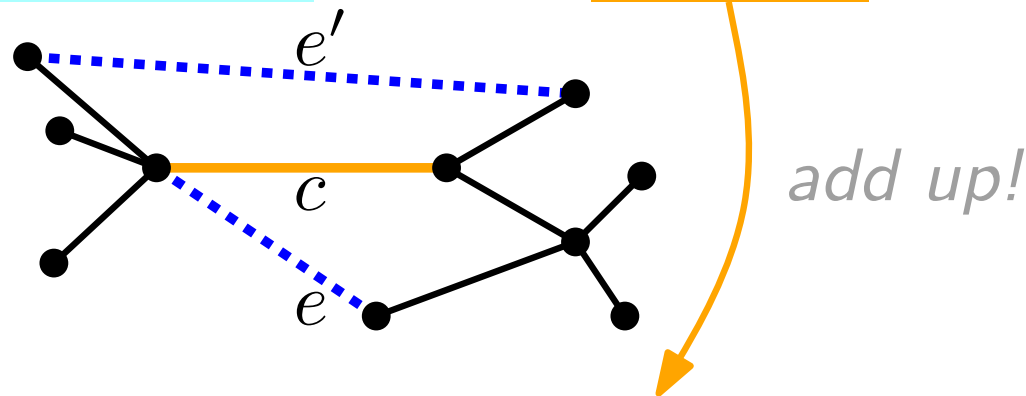
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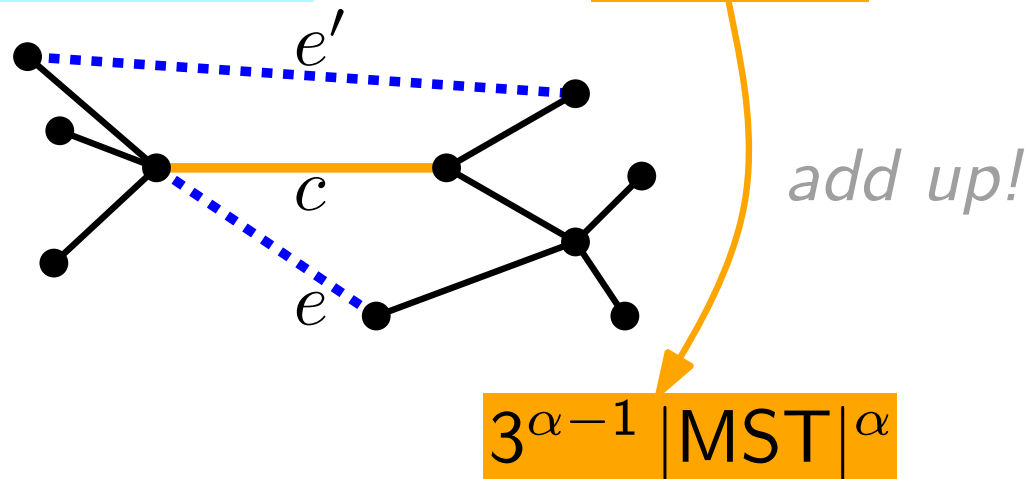
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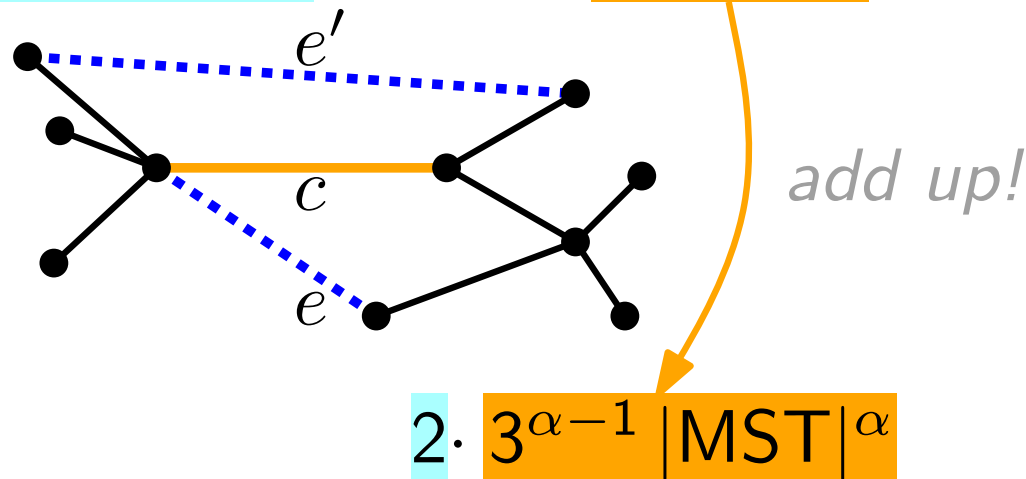
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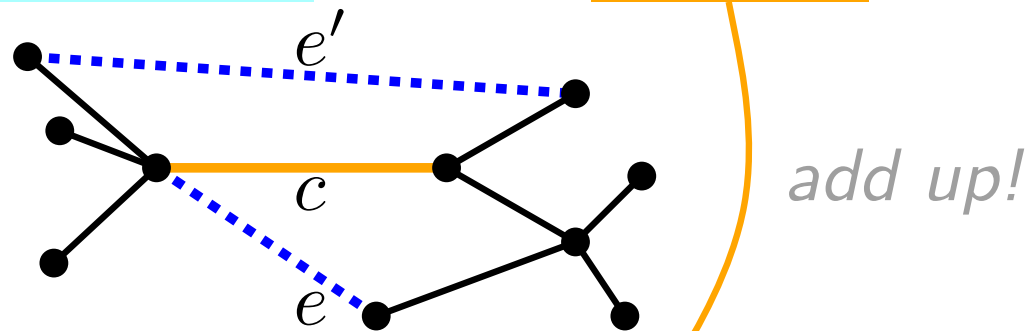
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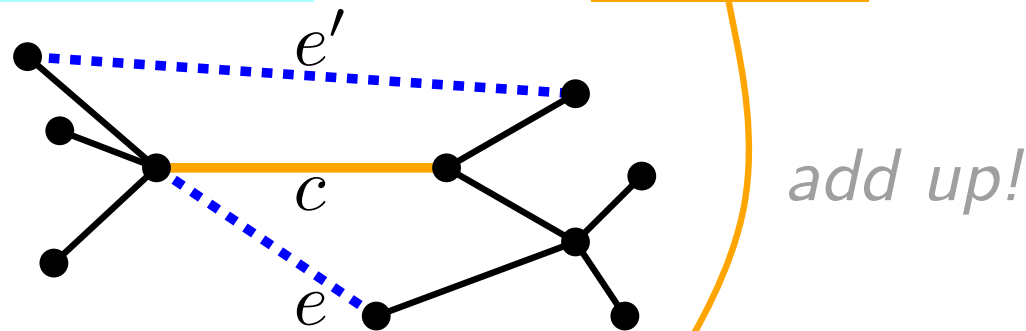
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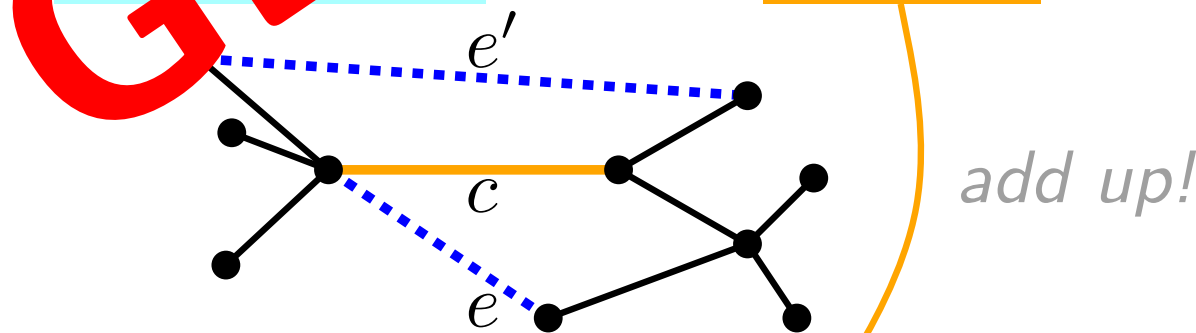
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Corollary. The T^3 -algorithm yields a $(2 \cdot 3^{\alpha-1})$ -approximation for $TSP(\cdot, \alpha)$ if $\alpha \geq 2$.

Result #2

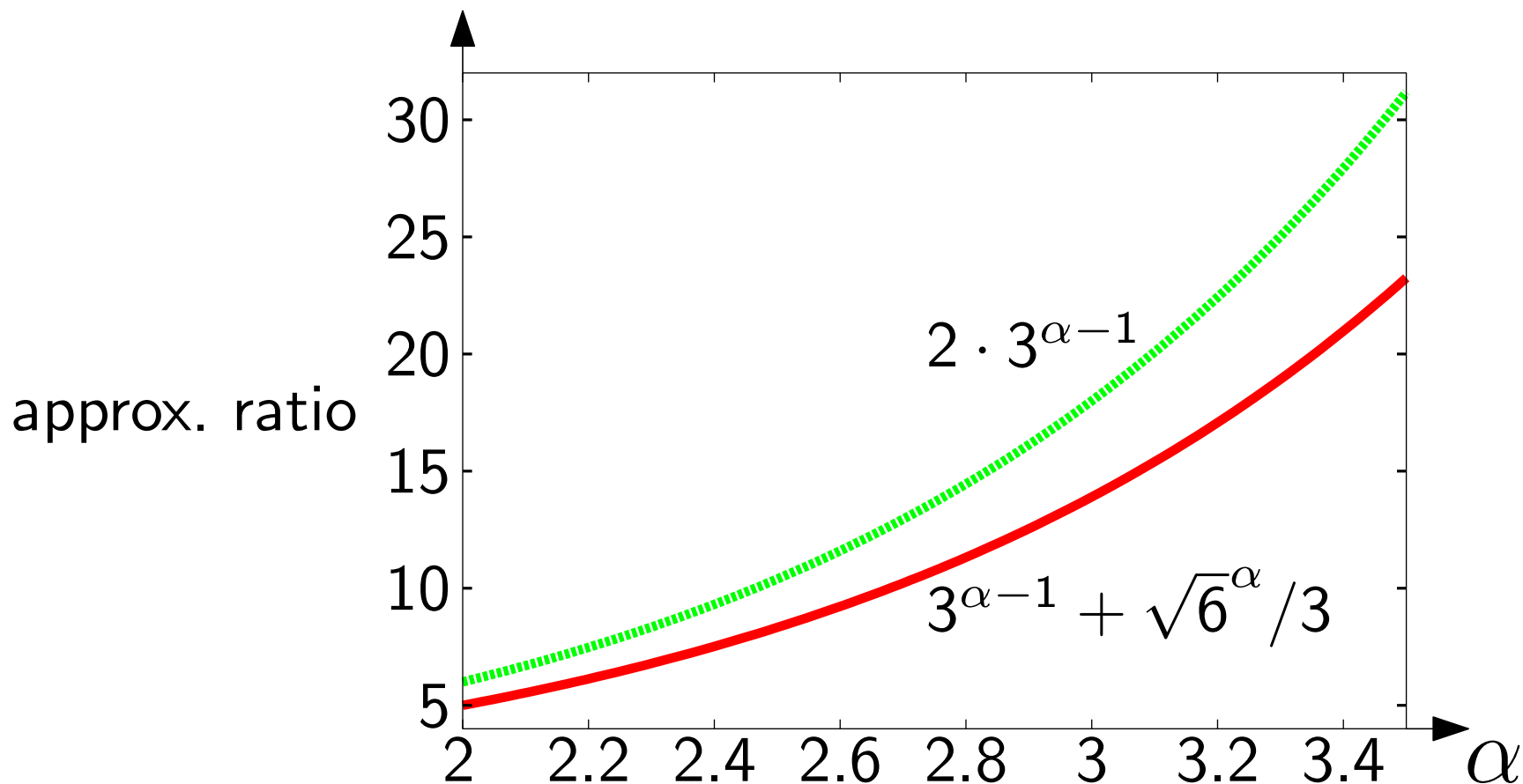
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Theorem. For $\alpha \geq 2$, the *geometric* T^3 -algorithm yields a $(3^{\alpha-1} + \sqrt{6}^\alpha / 3)$ -approximation for $TSP(2, \alpha)$.

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MST w.r.t. $|\cdot|^\alpha$



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MST w.r.t. $|\cdot|^\alpha$

GEOMETRIC T^3 (tree T , $e = u_1u_2$ of T)

for $i \leftarrow 1$ **to** 2 **do**

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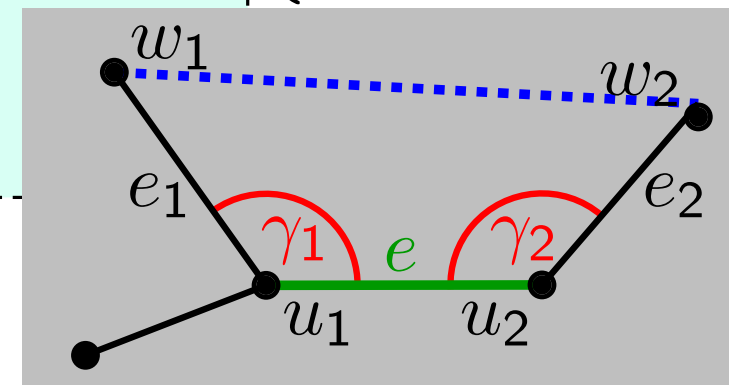
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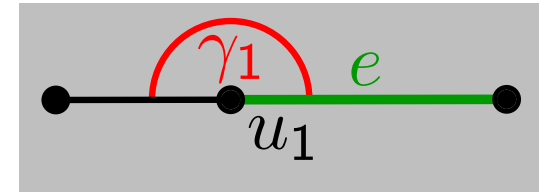
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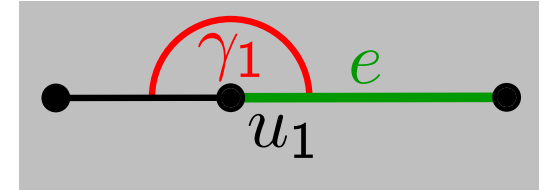


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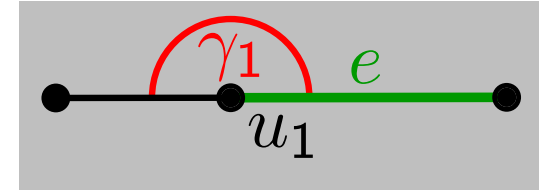


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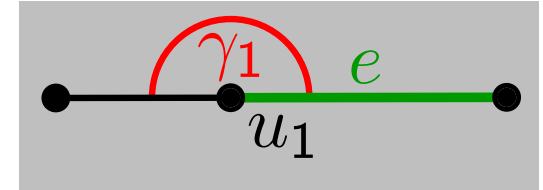
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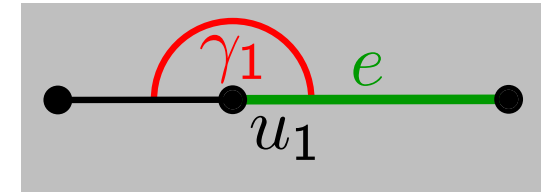
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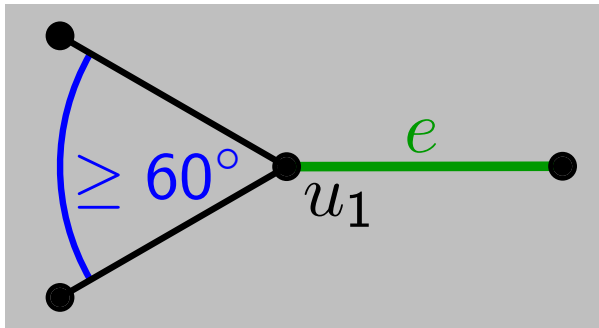
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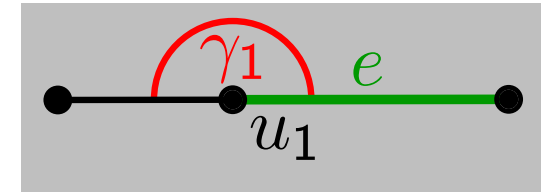
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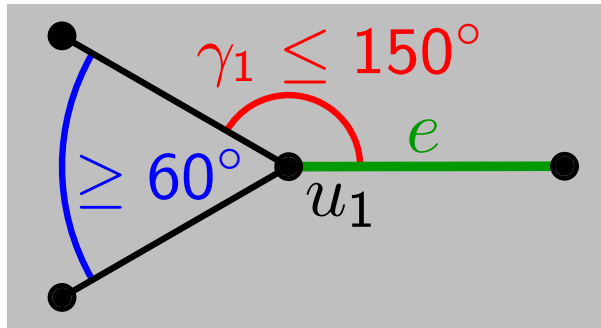
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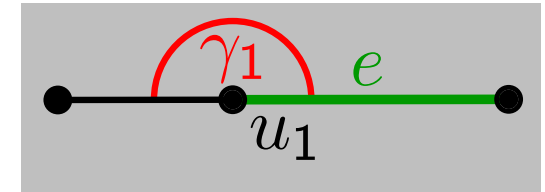
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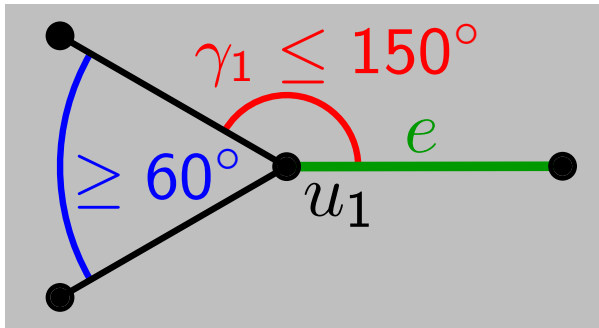
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Thus, there is an edge e_1 incident to u_1 with $\angle ee_1 \leq 150^\circ$.

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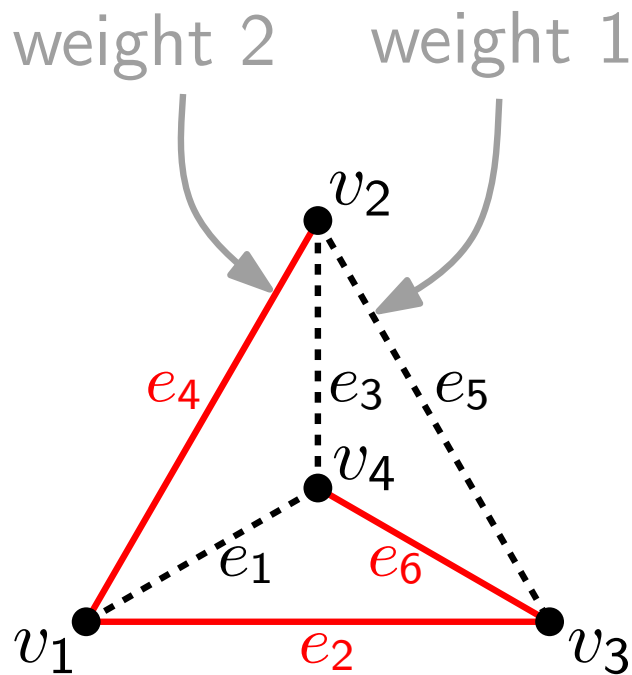
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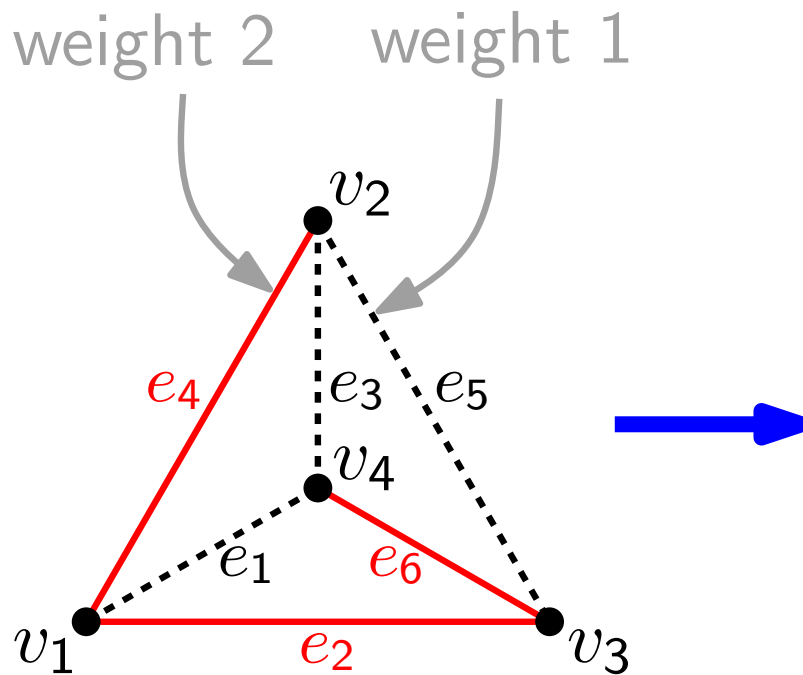
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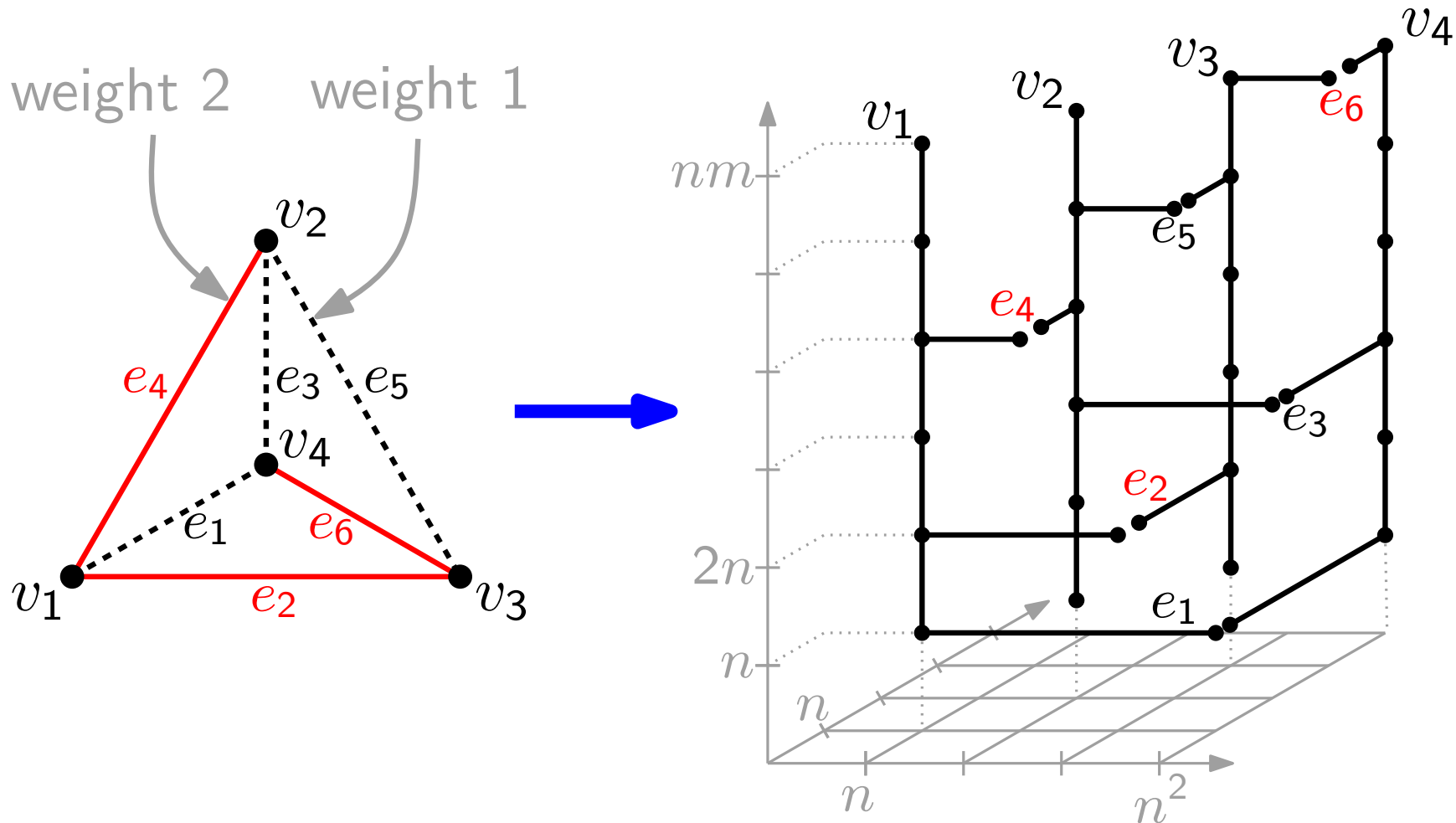
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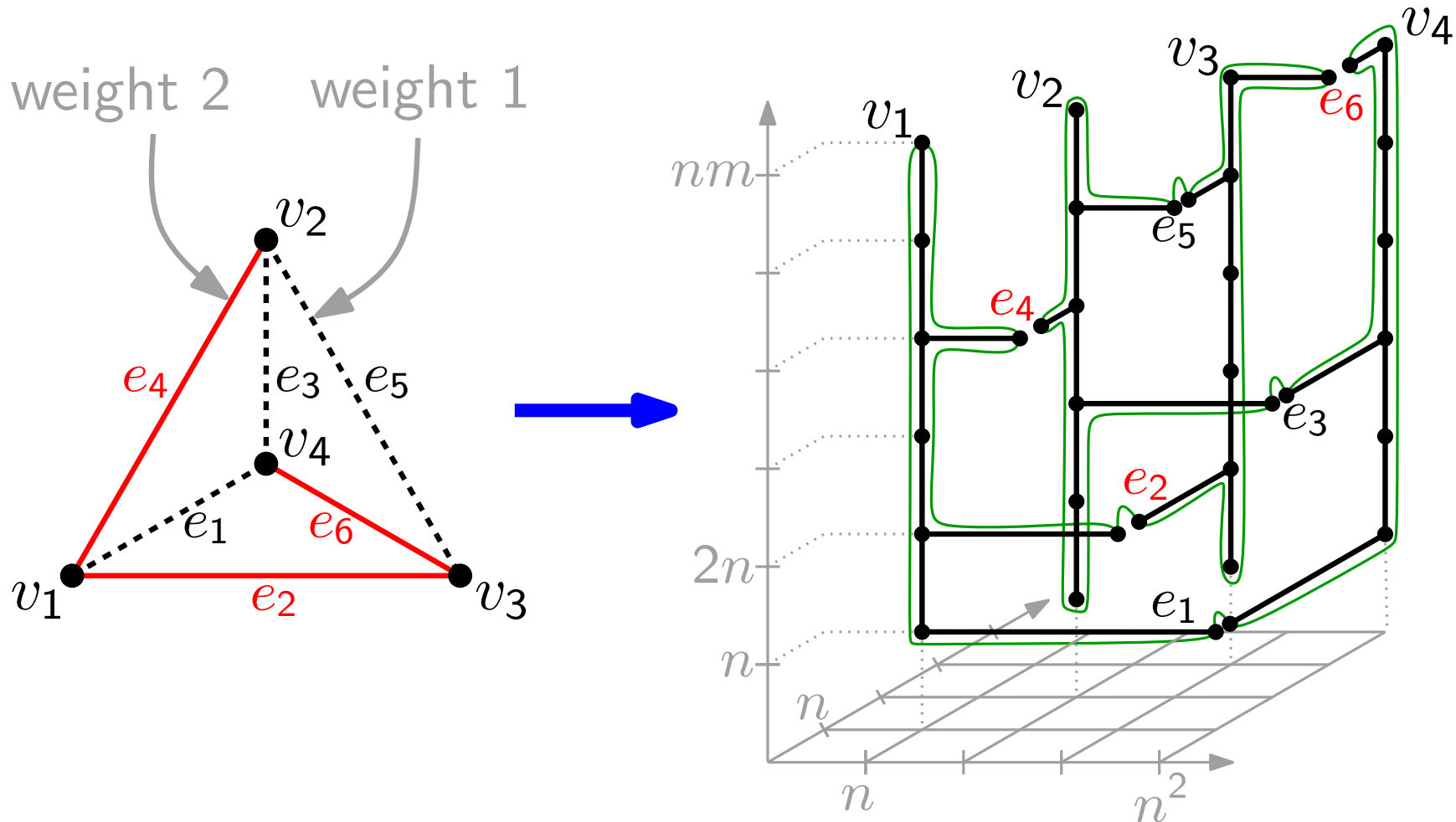
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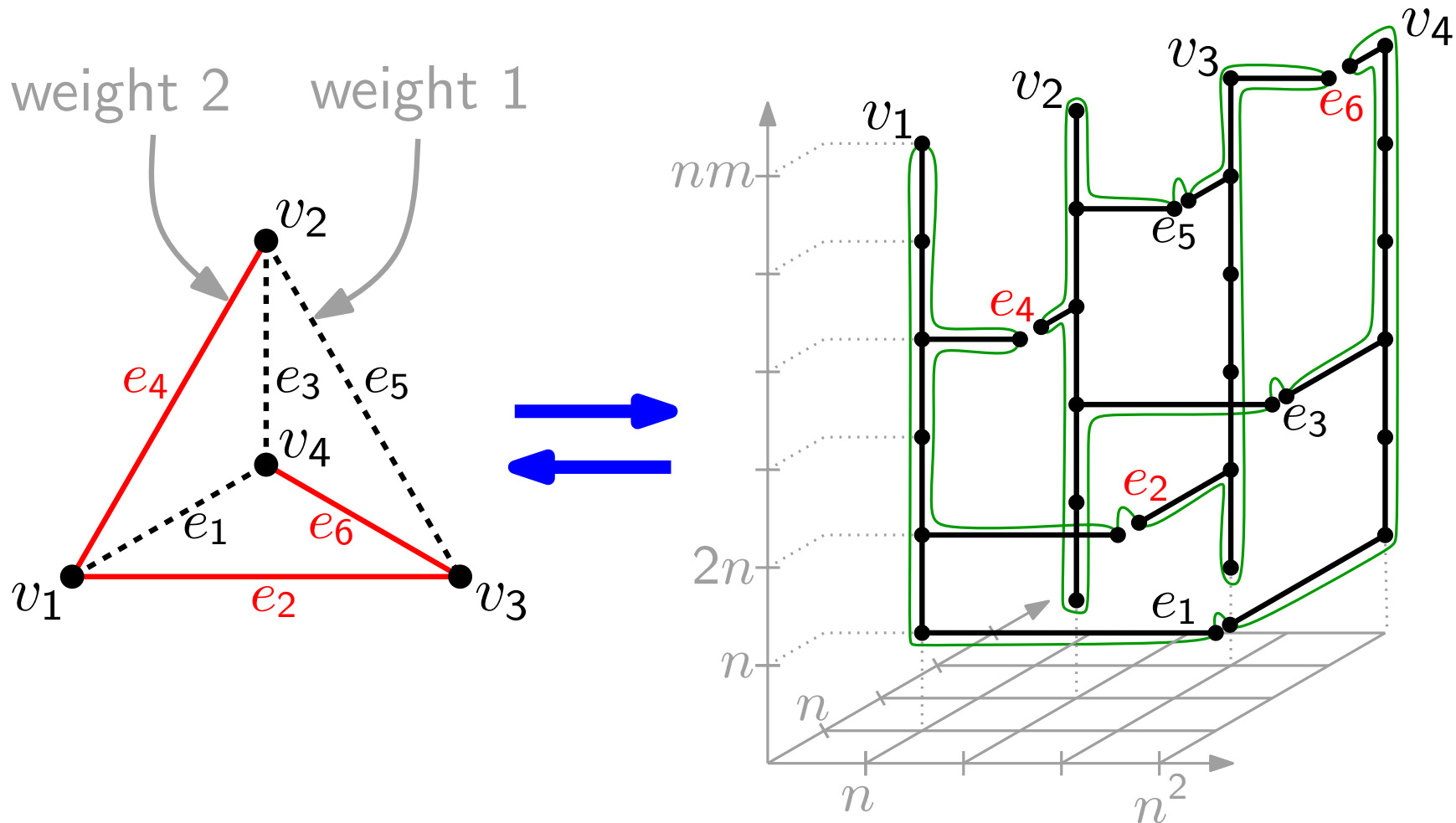
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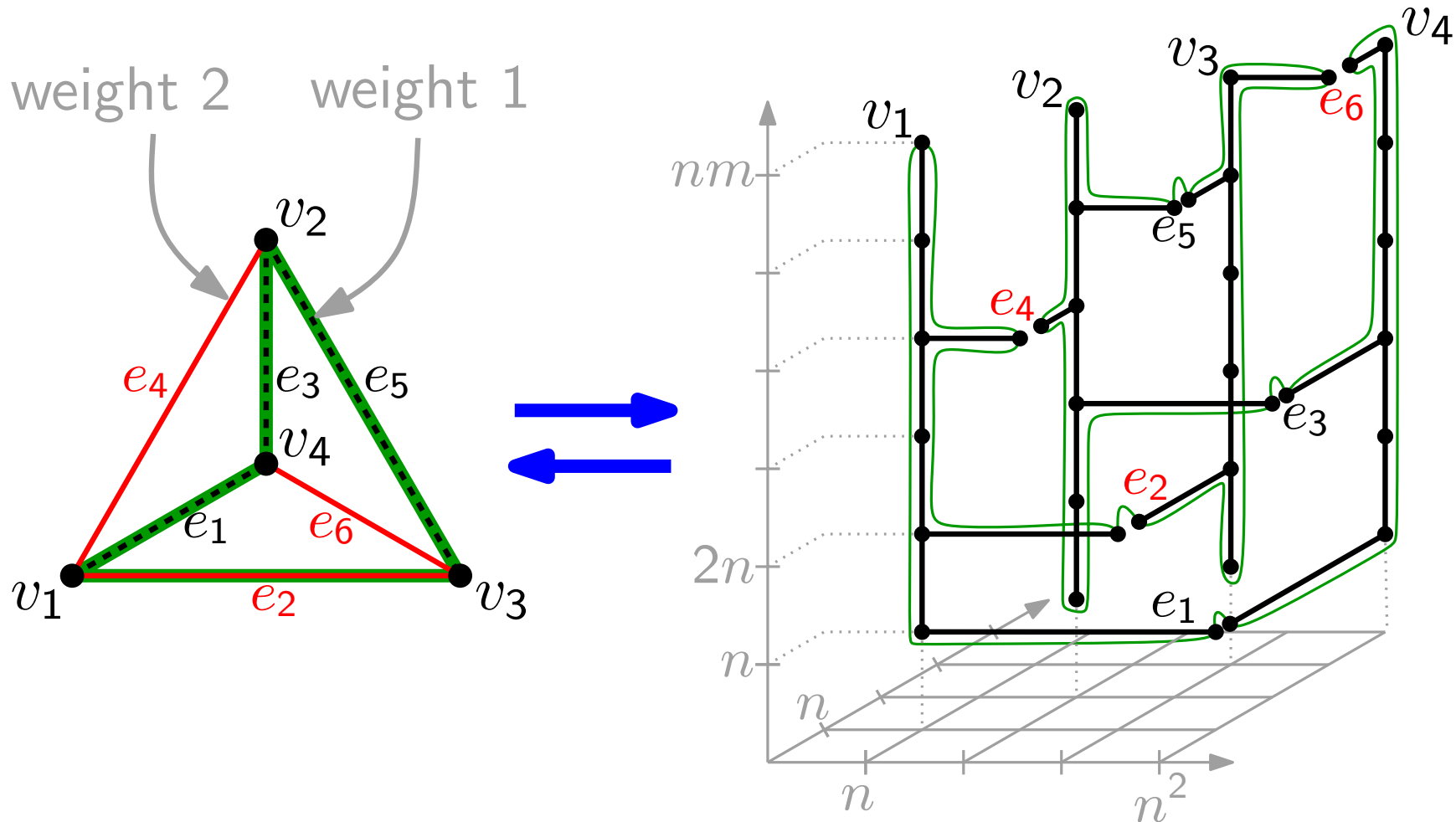
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