# Almost Polynomial Hardness of NDP-Grids 

JULIA CHUZHOY DAVID KIM RACHIT NIMAVAT

$\begin{array}{r}1 T \\ \hline 1\end{array}$
TOYOTA
TECHNOLOGICAL
INSTITUTE
AT CHICAGO

## Node-Disjoint Paths (NDP)

Input: Graph and demand pairs $\left(s_{1}, t_{1}\right), \ldots,\left(s_{k}, t_{k}\right)$


## Node-Disjoint Paths (NDP)

Input: Graph and demand pairs $\left(s_{1}, t_{1}\right), \ldots,\left(s_{k}, t_{k}\right)$


## Node-Disjoint Paths (NDP)

Input: Graph and demand pairs $\left(s_{1}, t_{1}\right), \ldots,\left(s_{k}, t_{k}\right)$


## Destinations

Goal: Route as many pairs as possible via node-disjoint paths

## Node-Disjoint Paths (NDP)

Input: Graph and demand pairs $\left(s_{1}, t_{1}\right), \ldots,\left(s_{k}, t_{k}\right)$


Sources
Destinations

Goal: Route as many pairs as possible via node-disjoint paths

## OPT: 2

## Known Results

Constant $k \Rightarrow$ Efficient algorithm [Robertson, Seymour '90] $k$ part of input $\Rightarrow$ NP-Hard $\quad[$ Karp '72]

## Known Results

Constant $k \Rightarrow$ Efficient algorithm [Robertson, Seymour '90] $k$ part of input $\Rightarrow$ NP-Hard $\quad\left[\right.$ Karp $\left.{ }^{\prime} 72\right]$
$O(\sqrt{n})$-approx. [Kolliopoulos, Stein ‘98]
Roughly $\Omega(\sqrt{\log n})$-hardness of approx. [Andrews, Zhang '05],
[Andrews, Chuzhoy, Guruswami, Khanna, Talwar, Zhang '10]

## Known Results

Constant $k \Rightarrow$ Efficient algorithm [Robertson, Seymour '90] $k$ part of input $\Rightarrow$ NP-Hard $\quad[$ Karp '72]
$O(\sqrt{n})$-approx. [Kolliopoulos, Stein '98]
Roughly $\Omega(\sqrt{\log n})$-hardness of approx. [Andrews, Zhang '05],
[Andrews, Chuzhoy, Guruswami, Khanna, Talwar, Zhang '10]

What about simpler cases?

## Known Results

|  | Upper Bound | Lower Bound |
| :---: | :---: | ---: |
| General NDP | $O(\sqrt{n})$ | $\Omega(\sqrt{\log n})$ |

## NDP-Grid:

- $O\left(n^{1 / 4}\right)$ - approx. for NDP-Grid [Chuzhoy, Kim '15]
-APX-hardness [Chuzhoy, Kim '15]


## Known Results

|  | Upper Bound | Lower Bound |
| :--- | :---: | :---: |
| General NDP | $O(\sqrt{n})$ | $\Omega(\sqrt{\log n})$ |
| NDP-Grid | $O\left(n^{1 / 4}\right)$ | APX-hardness |

NDP-Planar:

- O ( $n^{9 / 19}$ ) -approx. for NDP-Planar [Chuzhoy, Kim, Li '16]
- $2^{\Omega(\sqrt{\log n})}$-hardness [Chuzhoy, Kim, N '16]


## Known Results

|  | Upper Bound | Lower Bound |
| :--- | :---: | :---: |
| General NDP | $O(\sqrt{n})$ | $2^{\Omega(\sqrt{\log n})}$ |
| NDP-Grid | $O\left(n^{1 / 4}\right)$ | APX-hardness |
| NDP-Planar | $O\left(n^{9 / 19}\right)$ | $2^{\Omega(\sqrt{\log n})}$ |

"grids with holes" are hard
(even with sources on top)

Matching Upper Bound?

## NDP-Grid with Sources on Boundary

$2^{O(\sqrt{\log n})}$-approx. if sources on boundary [Chuzhoy, Kim, $\mathrm{N}^{\text {'17] }}$

- First sub-polynomial approx. algorithm!

$2^{\Omega(\sqrt{\log n})}$-hard


$$
2^{\mathrm{O}(\sqrt{\log n})} \text {-approx. }
$$

## Main Theorem

NDP-Grid is

$2^{\Omega\left(\log ^{1-\epsilon} n\right)}$-hard assuming NP $\nsubseteq \operatorname{RTIME}\left(n^{p o l y \log n}\right)$
For all
$\epsilon>0$

## Main Theorem

## Weaker than rETH

NDP-Grid is


## The Updated Picture

|  | Upper Bound | Lower Bound |
| :--- | :---: | :--- |
| General NDP | $O(\sqrt{n})$ | $n^{\Omega\left(1 /(\log \log n)^{2}\right)}$ |
| NDP-Planar | $O\left(n^{9 / 19}\right)$ | $n^{\Omega\left(1 /(\log \log n)^{2}\right)}$ |
| NDP-Grid | $O\left(n^{1 / 4}\right)$ | $n^{\Omega\left(1 /(\log \log n)^{2}\right)}$ |

## A Proxy Problem



Part 1: Graph Partitioning $\Rightarrow$ NDP-Grid
Part 2: 3COL $\Rightarrow$ Graph Partitioning

## How to Show Hardness? : The Karp Way

Suppose there is $\alpha$-approx. algorithm for NDP-Grid


NDP-Grid

## Graph Partitioning Problem



Bipartite graph B
Parameters: p,r

## Graph Partitioning Problem



Bipartite graph B
$p$ Pieces

## Graph Partitioning Problem



Bipartite graph B Parameters: p,r

$p$ Pieces

Maximize: \# surviving edges

## $\leq r$ edges

Looks like Densest k-Subgraph Problem...

## Graph Partitioning $\Rightarrow$ NDP on Grids

Theorem: Can construct NDP-Grid instance I s.t
Partitioning with many surviving edges <=> Routing a large number of demand pairs

Step 1: Construction
Step 2: Partitioning $\Rightarrow$ Routing [Skipped]
Step 3: Partitioning $\Leftarrow$ Routing


1


NDP-Grid I

## Constructing NDP-Grid



## 1

 |  |  |  |
| :--- | :--- | :--- |
|  |  |  |




NDP-Grid I

## Constructing NDP-Grid



NDP-Grid I

## Constructing NDP-Grid

-Box for each vertex of $B$ in source/destination row

- Demand pair $\left(s_{e}, t_{e}\right)$ for each edge $e$ of B
- Place $s_{e}$ and $t_{e}$ inside boxes of endpoints of $e$
Source Row $\frac{\#+\Delta y}{\square} \square$
Destination Row
$\qquad$


NDP-Grid I

## Constructing NDP-Grid

-Box for each vertex of $B$ in source/destination row

- Demand pair $\left(s_{e}, t_{e}\right)$ for each edge $e$ of B
- Place $s_{e}$ and $t_{e}$ inside boxes of endpoints of $e$

Destination Row




$$
1
$$



NDP-Grid I

## Constructing NDP-Grid

-Box for each vertex of $B$ in source/destination row

- Demand pair $\left(s_{e}, t_{e}\right)$ for each edge $e$ of B
- Place $s_{e}$ and $t_{e}$ inside boxes of endpoints of $e$


NDP-Grid I

## Constructing NDP-Grid

-Box for each vertex of $B$ in source/destination row

- Demand pair $\left(s_{e}, t_{e}\right)$ for each edge $e$ of B
- Place $s_{e}$ and $t_{e}$ inside boxes of endpoints of $e$


NDP-Grid I

## Constructing NDP-Grid

-Box for each vertex of $B$ in source/destination row

- Demand pair $\left(s_{e}, t_{e}\right)$ for each edge $e$ of B
- Place $s_{e}$ and $t_{e}$ inside boxes of endpoints of $e$


NDP-Grid I

## Graph Partitioning $\Leftarrow$ NDP on Grids

-Consider routing of a large subset of demand pairs


NDP-Grid I

## Graph Partitioning $\Leftarrow$ NDP on Grids

-Consider routing of a large subset of demand pairs

-Contract the blocks



NDP-Grid I

## Graph Partitioning $\Leftarrow$ NDP on Grids

-Consider routing of a large subset of demand pairs
-Contract the blocks



NDP-Grid I

## Graph Partitioning $\Leftarrow$ NDP on Grids

-Consider routing of a large subset of demand pairs
-Contract the blocks



NDP-Grid I

## Graph Partitioning $\Leftarrow$ NDP on Grids

-Consider routing of a large subset of demand pairs
-Contract the blocks



NDP-Grid I

## Graph Partitioning $\Leftarrow$ NDP on Grids

-Consider routing of a large subset of demand pairs
-Contract the blocks

## Drawing with low crossing number



NDP-Grid I

## Graph Partitioning $\Leftarrow$ NDP on Grids

-Consider routing of a large subset of demand pairs
-Contract the blocks

## Drawing with low crossing number



NDP-Grid I

## Graph Partitioning $\Leftarrow$ NDP on Grids

-Consider routing of a large subset of demand pairs
-Contract the blocks

## Drawing with low crossing number



## A Proxy Problem



Part 1: Graph Partitioning $\Rightarrow$ NDP-Grid
Part 2: 3COL $\Rightarrow$ Graph Partitioning

## How to Show Hardness? : The Cook Way



## How to Show Hardness? : The Cook Way



## How to Show Hardness? : The Cook Way



## 3COL5

Graph G: $n$ vertices, $m$ edges
Each vertex degree is exactly 5
Color vertices by $\{R G B\}$ such that no edge connects a pair of same color


## 3COL5

Graph G: $n$ vertices, $m$ edges
Each vertex degree is exactly 5
Color vertices by $\{R G B\}$ such that no edge connects a pair of same color


## 3COL5

Graph G: $n$ vertices, $m$ edges
Each vertex degree is exactly 5
Color vertices by $\{R G B\}$ such that no edge connects a pair of same color


1 legal coloring $\Rightarrow 6$ legal colorings!

## 3COL5



1 legal coloring $\Rightarrow 6$ legal colorings!

## 2 Prover Protocol

## Edge-Player, Vertex-Player

## 2 Prover Protocol

## Edge-Player, Vertex-Player

Verifier

$$
(u, v) \in_{r} E(G)
$$

## 2 Prover Protocol

## Edge-Player, Vertex-Player

Verifier

$$
\begin{gathered}
(u, v) \epsilon_{r} E(G) \\
u \in_{r}\{u, v\}
\end{gathered}
$$

## 2 Prover Protocol

## Edge-Player, Vertex-Player



## 2 Prover Protocol

## Edge-Player, Vertex-Player



## 2 Prover Protocol

## Edge-Player, Vertex-Player



## 2 Prover Protocol

## Edge-Player, Vertex-Player


$\mathrm{G}=\mathrm{NI} \Rightarrow$ For any strategy of provers, Verifier accepts with probability $\leq 1-\frac{\epsilon}{2}$

## Parallel Repetition

$l$ rounds
Think of $l$ as $\log ^{100} n$

$$
\left(e_{1}, e_{2}, \ldots, e_{l}\right) \longrightarrow \begin{gathered}
\text { Edge } \\
\text { Player }
\end{gathered} \longrightarrow(R B, G R, \ldots, R B)
$$

$$
\left(v_{1}, v_{2}, \ldots, v_{l}\right) \longrightarrow \begin{gathered}
\text { Vertex } \\
\text { Player }
\end{gathered} \longrightarrow(B, R, \ldots, B)
$$

## Parallel Repetition

$l$ rounds
Think of $l$ as $\log ^{100} n$

$$
\left(e_{1}, e_{2}, \ldots, e_{l}\right) \longrightarrow \begin{gathered}
\text { Edge } \\
\text { Player }
\end{gathered} \longrightarrow(R B, G R, \ldots, R B)
$$

Accept iff all answers match

$$
\left(v_{1}, v_{2}, \ldots, v_{l}\right) \longrightarrow \begin{gathered}
\text { Vertex } \\
\text { Player }
\end{gathered} \longrightarrow(B, R, \ldots, B)
$$

## Parallel Repetition

$l$ rounds
Think of $l$ as $\log ^{100} n$
Accept iff all answers match

$\mathrm{G}=\mathrm{Y} \mid \Rightarrow 6^{l}$ prover strategies where Verifier always accepts

## Parallel Repetition

$l$ rounds
Think of $l$ as $\log ^{100} n$

$$
\left(e_{1}, e_{2}, \ldots, e_{l}\right) \longrightarrow \begin{gathered}
\text { Edge } \\
\text { Player }
\end{gathered} \rightarrow(R B, G R, \ldots, R B)
$$

Accept iff all answers match

$$
\left(v_{1}, v_{2}, \ldots, v_{l}\right) \longrightarrow \begin{aligned}
& \text { Vertex } \\
& \text { Player }
\end{aligned} \longrightarrow(B, R, \ldots, B)
$$

$\mathrm{G}=\mathrm{Y} \mid \Rightarrow 6^{l}$ prover strategies where Verifier always accepts
$\mathrm{G}=\mathrm{NI} \Rightarrow$ Verifier accepts with prob. $\leq 2^{-\gamma l}$

## Parallel Repetition

$l$ rounds
Think of $l$ as $\log ^{100} n$

$$
\left(e_{1}, e_{2}, \ldots, e_{l}\right) \longrightarrow \begin{gathered}
\text { Edge } \\
\text { Player }
\end{gathered} \longrightarrow(R B, G R, \ldots, R B)
$$

Accept iff all answers match

$$
\left(v_{1}, v_{2}, \ldots, v_{l}\right) \longrightarrow \begin{array}{|}
\text { Vertex } \\
\text { Player }
\end{array} \longrightarrow(B, R, \ldots, B)
$$

$\mathrm{G}=\mathrm{Y} \mid \Rightarrow 6^{l}$ prover strategies where Verifier always accepts

## Good prover strategy <br> certifies that G is YI

$\mathrm{G}=\mathrm{NI} \Rightarrow$ Verifier accepts with prob. $\leq 2^{-\gamma l}$

## The Constraint Graph

-Bipartite graph
-Edge-Player queries on one side

- Vertex-Player queries on other


## The Constraint Graph

## -Bipartite graph

-Edge-Player queries on one side

- Vertex-Player queries on other
-Edge iff compatible queries


Verifier asks that
pair of queries

## The Reduction



## The Reduction



## The Reduction



## The Reduction



## The Reduction



## The Reduction



## The Reduction



## Eventually....



## Eventually....



Or:


## Eventually....



Or:


## Core Algorithm



## Core Algorithm: Simplified



The Constraint Graph


The Constraint Graph

$$
\begin{aligned}
& \left(e_{1}, e_{2}, \ldots, e_{l}\right) \longrightarrow \begin{array}{c}
\text { Edge } \\
\text { Player }
\end{array} \longrightarrow(R B, G R, \ldots, R B) \\
& \left(v_{1}, v_{2}, \ldots, v_{l}\right) \longrightarrow \begin{array}{c}
\text { Vertex } \\
\text { Player }
\end{array} \longrightarrow(B, R, \ldots, B)
\end{aligned}
$$



## The Constraint Graph

$$
\begin{aligned}
& \left(e_{1}, e_{2}, \ldots, e_{l}\right) \longrightarrow \begin{array}{c}
\text { Edge } \\
\text { Player }
\end{array} \longrightarrow(R B, G R, \ldots, R B) \\
& \left(v_{1}, v_{2}, \ldots, v_{l}\right) \longrightarrow \begin{array}{c}
\text { Vertex } \\
\text { Player }
\end{array} \longrightarrow(B, R, \ldots, B)
\end{aligned}
$$

- Only $6^{l}$ responses of edge-player -Only $3^{l}$ responses of vertex-player


The Cover Graph
-Query-vertices $\Rightarrow$ (Query, Answer)-vertices


## The Cover Graph

-Query-vertices $\Rightarrow$ (Query, Answer)-vertices
-Edge iff answers match


Verifier accepts

H

Edge
Vertex Player

## The Cover Graph

What if G is YI?
${ }^{\circ} 6^{l}$ strategies for H


The Cover Graph


## The Cover Graph

What if G is YI?
${ }^{\circ} 6^{l}$ strategies for H
Answers coming from the same strategy for all queries


A labelling of H



## Partitioning Problem



Partitioning with Many Surviving Edges

## Partitioning Problem

G is $\mathrm{YI} \quad \longleftrightarrow$

| Extract strategy from |
| :---: |
| partitioning with many |
| surviving edges? |

## Partitioning Problem



## Partitioning Problem

## G is YI



## Good Strategy for H



Cheating partition must exploit the structure of $\widehat{H}$...


## Partitioning Problem

## G is YI



Good Strategy for H


Cheating partition must exploit the structure of $\widehat{H}$...

Leverage it to break H into pieces!

## Partitioning Problem : Main Theorem



## Partitioning Problem



## G is NI

## Partitioning Problem



## Partitioning Problem



## Partitioning Problem



## The Core Algorithm



## Result

Size of 3COL5: $n$
Parallel repetition parameter: $l$
Size of the constraint graph: $n^{O(l)}$

## Result

Size of 3COL5: $n$
Parallel repetition parameter: $l$
Size of the constraint graph: $n^{O(l)}$
Setting parameters,


## Conclusion

- Upper and lower bounds for both, general-NDP and NDPGrids are now either polynomial or near polynomial
-Polynomial hardness for general-NDP?
-Congestion minimization?
When paths are allowed to share nodes
-Can get something for Densest k-Subgraph from this approach?


## Conclusion

- Upper and lower bounds for both, general-NDP and NDPGrids are now either polynomial or near polynomial
-Polynomial hardness for general-NDP?
-Congestion minimization?
When paths are allowed to share nodes
-Can get something for Densest k-Subgraph from this approach?


## Thank You!

