#### Longest Path in Graphs: 90's and 00's



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# *k*-Path.Input: Directed graph *G*; parameter *k*.Question: Does *G* have a path on at least *k* vertices?









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k-Path

#### Deterministic

$O^*(k!)$	Monien '85
$O^{*}(k!2^{k})$	Bodlaender '93
$O^{*}((2e)^{k+o(k)})$	Alon, Yuster and Zwick, '95
$O^{*}(4^{k+o(k)})$	Chen, kneis, Lu, Molle, Richter, Rossmanith, Sze and Zhang, '09
$O^*(2.851^k)$ Fomin, Lokshtanov, Panolan and Saurabh, '16	
$[O^*(2.619^k)]$	[-"-, Shachnai and Zehavi, '14]
$O^{*}(2.597^{k})$	Zehavi, '15





#### Deterministic

Other problems: 3-Set *k*-Packing, 3D *k*-Matching, subcases of Subgraph Isomorphism, Graph Motif, Partial Cover , *k*-Internal Out-Branching, ...

Chen, kneis, Lu, Molle, Richter, Rossmanith, Sze and Zhang, '09

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$$O^*(4^{k+o(k)})$$
 Chen, kneis, Lu, Molle, Richter, Rossmanith, Sze and Z

  $O^*(2.851^k)$ 
 Fomin, Loks

  $[O^*(2.619^k)]$ 
 Mixing:  $O^*(12.155^k)$ 
 $O^*(2.597^k)$ 
 Zehavi, '15





#### Randomized

$O^{*}(2^{k})$	Koutis and Williams, '09
<i>O</i> *(1.657 <sup><i>k</i></sup> )	Björklund, Husfeldt, Kaski and Koivisto, '10 (Undirected)



# (Art?) Tutorial

- **1. Brute-Force**
- 2. Highlights
- **3. Color Coding**
- 4. Divide-and-Color
- 5. Representative Sets
- 6. Mixing





#### k-Path: Brute-Force

# *k*-Path.Input: Directed graph *G*; parameter *k*.Question: Does *G* have a path on at least *k* vertices?





#### k-Path: Brute-Force







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# Color-set: {1,2,...,k}.

### To each vertex, randomly assign a color.





# Color-set: {1,2,...,k}.

To each vertex, randomly assign a color.

Highlight a solution.







# The probability of highlighting a solution: $1/k^k$ .





# 

#### In each iteration:

- Remove irrelevant edges.
- Is there a path from a vertex colored 1 to a vertex colored k?





### Probability of highlighting a solution: $1/k^k$ . $\rightarrow O^*(k^k)$ iterations.

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#### Running time: $O^*(k^k)$ .





#### Running time: $O^*(k^k)$ . [Randomized.]





#### **Derandomization:**

A family *F* of functions  $f:[n] \rightarrow [k]$  such that for all  $I \subseteq [n]$  of size *k* and function  $g:I \rightarrow [k]$ , there exists  $f' \in F$  that ``agrees'' with *g*.





#### **Derandomization:**

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#### $|F|=O^{*}(k^{k}\cdot 2^{o(k)})$ in time $O^{*}(k^{k}\cdot 2^{o(k)})$ .

**Useful to know:** k-wise independent sample space; (n,k)-perfect hash family.

[Alon, Babai and Itai, '86; Alon, Yuster and Zwick, '95].



### Koutis and Williams, '09: $O^*(2^k)$ . [Randomized.] Björklund, Husfeldt, Kaski and Koivisto, '10: $O^*(1.657^k)$ . [Randomized; Undirected.]







# Koutis and Williams, '09: $O^*(2^k)$ . [Randomized.] Björklund, Husfeldt, Kaski and Koivisto, '10: $O^*(1.657^k)$ . [Randomized; Undirected.]

Polynomial identity testing.

(incl. algebraic interpretation of ideas presented in this talk.)









- **1. Brute-Force**
- 2. Highlights

6. Mixing

- **3. Color Coding**
- 4. Divide-and-Color
- **5. Representative Sets**



Alon, Yuster and Zwick, '95



# **Again:** Color-set: $\{1, 2, ..., k\}$ . $\bigcirc \bigcirc \bigcirc \bigcirc \bigcirc \bigcirc$ To each vertex, randomly assign a color.





# Again: Color-set: {1,2,...,k}. ● ● ● ● ● ● ● To each vertex, randomly assign a color. Easier request: Colorful solution.





# The probability of coloring a solution correctly:

 $k!/k^k \approx 1/e^k$ .







#### In each iteration:

- M[v,S]: Is there an S-colorful path that ends at v?





#### In each iteration:

- M[v,S]: Is there an S-colorful path that ends at v?
- $M[v,S] = V_{(u,v) \in E} M[u,S \setminus \{color(v)\}]$





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# Probability of coloring a sol correctly: $1/e^k$ . $\rightarrow O^*(e^k)$ iterations.







#### Running time: $O^*((2e)^k)$ .





#### Running time: $O^*((2e)^k)$ . [Randomized.]





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A family F of functions  $f:[n] \rightarrow [k]$  such that for all  $I \subseteq [n]$  of size k, there exists  $f' \in F$ such that  $f'|_I$  is an injective function.





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#### $|F|=O^*(e^{k+o(k)})$ in time $O^*(e^{k+o(k)})$ .

**Useful to know:** (n,k,l)-splitter; (n,k)-perfect hash family;  $\delta$ -balanced (n,k)-perfect hash family. [Naor, Schulman and Srinivasan, '95; Alon, Yuster and Zwick, '95; Alon and Gutner, '10].



### **Running time:** $O^*((2e)^{k+o(k)})$ . [Deterministic.]






k-Path: Color Coding

#### Running time: $O^*((2e)^{k+o(k)})$ . [Deterministic.]





#### (Art?) Tutorial

- **1. Brute-Force**
- 2. Highlights
- **3. Color Coding**
- 4. Divide-and-Color



- 5. Representative Sets
- 6. Mixing Chen, Kneis, Lu, Mölle, Richter, Rossmanith, Sze and Zhang, '09



#### Color-set: $\{\mathbf{R},\mathbf{B}\}$ .

#### To each vertex, randomly assign a color.





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#### Color-set: $\{\mathbf{R},\mathbf{B}\}$ .

To each vertex, randomly assign a color. **Easier request:** Divide a solution ([k/2], [k/2]).

### **Multiple paths:** For all $u, v \in V$ , does there exist a (u,v)-path?





### The probability of dividing a solution: $1/2^k$ .





#### In each iteration:

- **Red graph**: solve [k/2]-Path (recursive call).





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- **Red graph**: solve [k/2]-Path (recursive call).

#### (x,y); (x,z); (p,q).





#### In each iteration:

- (x,y);(x,z);(p,q).
- **Blue graph**: solve  $\lfloor k/2 \rfloor$ -Path (recursive call).





#### In each iteration:

- (x,y);(x,z);(p,q).
- **Blue graph**: solve [*k*/2]-Path (recursive call).





#### In each iteration:

- (x,y);(x,z);(p,q).
- (a,b);(c,d);(c,e);(f,g);(f,i);(h,g);(h,j);(l,m).
- Glue:  $(\alpha,\beta),(\gamma,\delta)$  where  $(\beta,\gamma) \in E$ .





In each iteration: (*x*,*g*)

- $(x,y);(x,\underline{z});(p,q).$
- $(a,b);(c,d);(c,e);(\underline{f},g);(f,i);(h,g);(h,j);(l,m).$
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In each iteration: (x,g);(x,i)

- $(x,y);(x,\underline{z});(p,q).$
- (a,b);(c,d);(c,e);(f,g);(f,i);(h,g);(h,j);(l,m).
- Glue:  $(\alpha,\beta),(\gamma,\delta)$  where  $(\beta,\gamma) \in E$ .





#### Probability of coloring a sol correctly: $1/2^k$ . $\rightarrow O^*(2^k)$ iterations.









#### Running time: $O^*(4^k)$ . [Randomized.]





#### **Derandomization:**

A family F of functions  $f: [n] \rightarrow [2]$  such that for all  $I \subseteq [n]$  of size k and function g: I $\rightarrow [2]$ , there exists  $f' \in F$  that ``agrees'' with





#### **Derandomization:**

A family F of functions  $f:[n] \rightarrow [2]$  such that for all  $I \subseteq [n]$  of size k and function  $g: I \rightarrow [2]$ , there exists  $f' \in F$  that ``agrees'' with g.

#### $|F|=O^*(2^{k+o(k)})$ in time $O^*(2^{k+o(k)})$ .

**Useful to know:** (*n*,*k*)-universal set; (*n*,*k*,*p*)-universal set. [Naor, Schulman and Srinivasan, '95; Fomin, Lokshtanov, Panolan and Saurabh, '16].



#### **Running time:** $O^*(4^{k+o(k)})$ . [Deterministic.]







#### **Running time:** $O^*(4^{k+o(k)})$ . [Deterministic.]





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- **1. Brute-Force**
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- 4. Divide-and-Color
  - Extra Example
- 5. Representative Sets

#### 6. Mixing







### Long Cycle. Input: Directed graph G; parameter k. Question: Does G have a cycle on at least k vertices?





Long Cycle. **Input:** Directed graph G; parameter k. **Question:** Does G have a cycle on **at least** k vertices?



solve 2k-Path



Long Cycle.
Input: Directed graph G; parameter k.
Question: Does G have a cycle on at least k vertices?

**Running time:** Deterministic.  $O^*(\max{\{\mathbf{P}(2k), 4^{k+o(k)}\}})$ Randomized.  $O^*(4^k)$ .

Zehavi, '16

Step 1.

Determine whether G has a *t*-cycle for  $t \in \{k, ..., 2k\}$ .



#### Step 2 (multiple times).

i. To each vertex, assign a color (R/B).





#### Step 2 (multiple times).

- i. To each vertex, assign a color (R/B).
- ii. For all  $u, v \in \mathbf{R}$ :
  - a) **P** shortest (u,v)-path in  $G[\mathbb{R}]$  (BFS). If  $|V(\mathbb{P})| \neq k$ : Next iteration.





#### Step 2 (multiple times).

- i. To each vertex, assign a color (R/B).
- ii. For all  $u, v \in \mathbf{R}$ :
  - a) *P* shortest (*u*,*v*)-path in *G*[**R**] (BFS).
    If | *V*(*P*) | ≠*k*: Next iteration.
    b) If there is a (*v*,*u*)-path in *G*\(*V*(*P*)\{*u*,*v*}):

Accept.





#### Step 2 (multiple times).

- i. To each vertex, assign a color (R/B).
- ii. For all  $u, v \in \mathbf{R}$ :
  - a) **P** shortest (u,v)-path in  $G[\mathbb{R}]$  (BFS). If  $|V(\mathbb{P})| \neq k$ : Next iteration.
  - b) If there is a (v,u)-path in  $G \setminus (V(\mathbf{P}) \setminus \{u,v\})$ : Accept.

iii. Reject.



A shortest cycle on at least k vertices:



























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- **5. Representative Sets**
- 6. Mixing Fomin, Lokshtanov, Panolan and Saurabh, '16



#### k-Path: Representative Sets

#### Goal: DP: add one vertex at a time (color coding).




#### Goal:

**DP:** add one vertex at a time (color coding). **Tool:** erase redundancy; new step  $\rightarrow$  new application (div-and-col).







#### Goal:

# DP: add one vertex at a time.Tool: erase redundancy.Coloring?





#### **Coloring**?

# Implicit in the proof of the construction of the tool (black box).





## **Tool:** erase redundancy. Computation of a **representative family**.





#### What is redundant?





#### What is redundant?







#### What is redundant?





#### What is redundant?





p,

k-Path: Representative Sets

#### **Representative family**:

Let S be a family of p-sets. A subfamily S' of S *k*-represents S if: For all disjoint  $X \in S$  and  $Y \subseteq V$  of size k-

there exists  $X' \in S'$  disjoint from Y.





#### DP:

- M[v,p]: The family of vertex-sets of paths on p vertices that end at v.

- 
$$M[v,p] = U_{(u,v) \in E} M[u,p-1] + \{v\}.$$





#### DP:

- M[v,p]: Representative family of the family of vertex-sets of paths on p vertices that end at v.
- M[v,p] = k-represent $(U_{(u,v)} \in EM[u,p-1])$





$$M[v,p] = k$$
-represent $(U_{(u,v) \in E} M[u,p-1] + \{v\})$ .

#### **Running time:** [randomized/deterministic] *k*-representative family of size $\binom{k}{p} 2^{o(k)} \log n$ can be computed in time $O(|\mathcal{S}|(k/(k-p))^{k-p} 2^{o(k)} \log n)$ .





$$M[v,p] = k$$
-represent $(U_{(u,v) \in E} M[u,p-1] + \{v\}).$ 

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$$O^*(\max_{p} \{ |\mathbf{M}[\cdot,p-1]| \cdot (k/(k-p))^{k-p} 2^{o(k)} \} )$$



$$M[v,p] = k$$
-represent $(U_{(u,v)} \in E} M[u,p-1] + \{v\}).$ 

**Running time:** [randomized/deterministic] *k*-representative family of size  $\binom{k}{p} 2^{o(k)} \log n$  can be computed in time  $O(|\mathcal{S}|(k/(k-p))^{k-p} 2^{o(k)} \log n)$ .

$$O^{*}(\max_{p} \{ \binom{k}{p-1} \underbrace{2^{o(k)} \cdot (k/(k-p))^{k-p} \underbrace{2^{o(k)}}_{p} \} ) = O^{*}(2.851^{k})$$



$$M[v,p] = k$$
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$$O^*(\max_{p} \{ \binom{k}{p-1} \underbrace{2^{o(k)} \cdot (k/(k-p))^{k-p} \underbrace{2^{o(k)}}_{p} \} ) = O^*(2.851^k)$$



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**Running time:**  $O^*(2.597^k)$ .

#### Intuition:

Layer 1. Correct coloring of a solution.









**Running time:**  $O^*(2.597^k)$ .

#### Intuition:

#### Layer 2. Correct coloring of a solution.









**Running time:**  $O^*(2.597^k)$ .

#### Intuition:



Layer 3 (DP). Family of *p*-paths that end at *v*.





Intuition:

# **Layer 3 (DP).** Family of *p*-paths that end at *v*.

First part of the computation:



Second part of the computation:







#### Intuition:

# **Layer 3 (DP).** Family of *p*-paths that end at *v*.

The worst time to compute a representative family:







More general def. + computation of representative sets.

Given the blue set, it is easy to find the dark and light blue sets.





### k-Path: Conclusion

- Directed *k*-Path: highlighting; color coding; divideand-color; representative sets; mixing.
- Directed Long Cycle.



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- Directed *k*-Path: highlighting; color coding; divideand-color; representative sets; mixing.
- Directed Long Cycle.
- Other problems: 3-Set *k*-Packing, 3D *k*-Matching, subcases of Subgraph Isomorphism, Graph Motif, Partial Cover, *k*-Internal Out-Branching, ...



### k-Path: Conclusion

- Directed *k*-Path: highlighting; color coding; divideand-color; representative sets; mixing.
- Directed Long Cycle.

#### **Open problems:**

- Directed *k*-Path:  $O^*(2^k)$  (deterministic).
- Directed Long Cycle:  $O^*(4^k)$  (deterministic).
- Directed *k*-Path:  $O^*((4-\varepsilon)^k)$  (deterministic;

polynomial space).

## Thank you for your attention.



#### **Questions?**