# An Efficient Algorithm for Partial Order Production



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## Sorting by Comparisons

**Input:** a set T of size n, totally ordered by  $\leq$ 

**Goal:** place the elements of T in a vector v in such a way that

 $v[1] \leqslant v[2] \leqslant \cdots \leqslant v[n]$ 

after asking a min number of questions of the form "is  $t \leq t'$ ?"



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Partial Order Production ("Partial Sorting")

**Input:** a set T of size n, totally ordered by  $\leq$ a partial order  $\preccurlyeq$  on the set of positions  $[n] := \{1, 2, ..., n\}$ 

**Goal:** place the elements of T in a vector v in such a way that

 $v[i] \leqslant v[j]$  whenever  $i \preccurlyeq j$ 

after asking a min number of questions of the form "is  $t \leq t'$ ?"



# Particular Cases (1/2)

Heap Construction



or



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Particular Cases (2/2)

Multiple Selection



Find the elements of rank  $r_1, r_2, \ldots, r_k$ 

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Particular Cases (2/2)

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Target poset  $P := ([n], \preccurlyeq)$  is a weak order

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∃ near-optimal algorithm (Kaligosi, Mehlhorn, Munro and Sanders, 05)

### Worst Case Lower Bounds

#### Well known fact. For Sorting by Comparisons:

worst case #comparisons  $\ge \lg n!$ 



worst case 
$$\#$$
comparisons  $\geq \underbrace{\lg n! - \lg e(P)}_{=:LB}$ 

where e(P) := # linear extensions of P



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 $||eaf set| \le e(P) \Longrightarrow \#comparisons \ge \lg \frac{n!}{e(P)} = LB$ 

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1976 Schönage defined POP problem

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1985 two surveys: Bollobás & Hell, and Saks. Saks conjectured that  $\exists$  algorithm for POP problem s.t. worst case #comparisons = O(LB) + O(n)

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1989 Yao solved Saks' conjecture, stated open problems

## Our Result

There exists a  $O(n^3)$  algorithm for the POP problem s.t.

worst case #comparisons = LB + o(LB) + O(n)

#### Improvements over Yao's algorithm:

- overall complexity is polynomial
- smaller number of comparisons

# A Simple Plan

- 1. Extend the target poset  ${\it P}$  to a weak order  ${\it W}$
- 2. Solve the problem for W using Multiple Selection algorithm



Key Tool: the Entropy of a Graph

The entropy of G = (V, E) equals:

$$H(G) := \min_{x \in STAB(G)} -\frac{1}{n} \sum_{v \in V} \lg x_v$$

where STAB(G) := stable set polytope of G

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- Introduced in information theory by J. Körner (73)
- Graph invariant with lots of applications (mostly in TCS)
  - bounds for perfect hashing
  - circuit lower bounds for monotone Boolean functions
  - sorting under partial information (Kahn and Kim 95)

▶ ...







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# Comparability Graphs and Entropy

G(P) := comparability graph of target poset PH(P) := H(G(P))



Lemma. (Stanley 86)  $\operatorname{Vol}(STAB(G(P))) = \frac{e(P)}{n!}$ Corollary.  $n H(P) - n \lg e \le LB \le n H(P)$ 

#### Weak Order Extensions — Colorings

#### Observation.

Every weak order extension W of P gives a coloring of G(P)  $\Downarrow$ Want: "good" coloring of G(P)

$$\begin{array}{rcl} W \text{ extends } P & \Longrightarrow & STAB(G(P)) \supseteq STAB(G(W)) \\ & \Longrightarrow & H(P) \leq H(W) \end{array}$$

#### Intuition.

H(W) should be as small as possible  $\downarrow$ The class sizes should be distributed as **unevenly** as possible

#### Greedy Colorings and Greedy Points For *G* = perfect graphs

Iteratively remove a maximum stable set from G

 $\rightsquigarrow$  sequence  $S_1, S_2, \ldots, S_k$  of stable sets

• Gives greedy coloring (k colors, ith color class =  $S_i$ )

Also gives greedy point:

$$\tilde{x} := \sum_{i=1}^{k} \frac{|S_i|}{n} \cdot \chi^{S_i} \in STAB(G)$$

**Theorem.** Let G be a perfect graph on n vertices and denote by  $\tilde{g}$  the entropy of an arbitrary greedy point  $\tilde{x} \in STAB(G)$ . Then

$$ilde{g} \leq rac{1}{1-\delta} \left( \mathsf{H}(\mathsf{G}) + \lg rac{1}{\delta} 
ight)$$

for all  $\delta > 0$ , and in particular

$$\widetilde{g} \leq H(G) + \lg H(G) + O(1).$$

Proof idea. Dual fitting, using min-max relation

$$H(G)+H(\bar{G})=\lg n$$

due to Csiszár, Körner, Lovász, Marton and Simonyi (90)





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Weak order extensions of  $P \rightarrow$  colorings of G(P) $\not\leftarrow$ 

 $\implies$  need to "uncross" our greedy colorings

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# Uncrossing a Greedy Coloring

D = D(P) := auxiliary network with source *s*, sink *t* D = (N(D), A(D))



 $4^+$   $5^+$   $6^+$  $4^ 5^ 6^ 1^+$   $2^+$   $3^+$  $1^ 2^ 3^-$ 

(H-potential) min 
$$-\frac{1}{n} \sum_{v \in V} \lg x_v$$
  
s.t.  $x_v = y_{v^+} - y_{v^-} \quad \forall v \in V$   
 $y_a \leqslant y_b \qquad \forall (a, b) \in A(D)$   
 $y_s = 0$   
 $y_t = 1$ 

Find potential  $\tilde{y}$  for greedy point  $\tilde{x}$  (by DP)

We get:

- collection of open intervals  $\left\{ \left( \tilde{y}_{v^{-}}, \tilde{y}_{v^{+}} \right) \right\}_{v \in V}$
- interval order I extending P, with H(I) close to H(P)







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Main Steps of our Algorithm

1. 
$$P \stackrel{greedy+DP}{\hookrightarrow} I$$

2. 
$$I \stackrel{greedy}{\hookrightarrow} W$$

3. Use Multiple Selection algorithm of Kaligosi et al. on W

**Theorem.** The algorithm above solves the POP problem, in  $O(n^3)$  time, after performing at most

LB + o(LB) + O(n)

comparisons

# Further Result & Open Questions

#### **Tightness result:**

 Any algorithm reducing the POP problem to Multiple Selection can be forced to perform

 $LB + \Omega(n \lg \lg n)$ 

comparisons for some P with  $H(P) \approx \frac{1}{2} \lg n$ 

#### **Open questions:**

▶ Is there an algorithm performing LB + O(n) comparisons?

What about Partial Order Production under Partial Information?

# **Thank You!**

#### P.S.: The paper is available on ArXiv