

# KNAPSACK AND SUBSET SUM WITH SMALL ITEMS

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# HIGHLIGHTS OF ALGORITHMS

University of Copenhagen, June 14-16, 2019



Saturday, June 15

|               |   |                            |
|---------------|---|----------------------------|
| 9:00 - 9:55   | <b>Thomas Vidick</b> — Survey on quantum program checking and quantum multiprover interactive proof systems | <a href="#">[abstract]</a> |
| 10:00 - 10:25 | <b>Cliff Stein</b> — A fast algorithm for knapsack via convolution and prediction                           | <a href="#">[abstract]</a> |
| 10:30 - 11:00 | Coffee Break  |                            |
| 11:00 - 11:25 | <b>Sebastien Bubeck</b> — k-server via multiscale entropic regularization                                   | <a href="#">[+]</a>        |
| 11:30 - 11:55 | <b>Nima Anari</b> — Planar Graph Perfect Matching is in NC  | <a href="#">[abstract]</a> |
| 12:00 - 12:25 | <b>Greg Bodwin</b> — On the Structure of Unique Shortest Paths in Graphs                                    | <a href="#">[abstract]</a> |

# KNAPSACK



$t = 1500\text{g}$   
max capacity

|   |                           |       |       |
|---|---------------------------|-------|-------|
| ? | A yellow saxophone icon.  | 1000g | \$300 |
| ? | A red book icon.          | 420g  | \$50  |
| ? | An orange croissant icon. | 85g   | \$2   |
| ? | A brown football icon.    | 415g  | \$49  |

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# KNAPSACK



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|---|--|-------|-------|---------|
| ↖ |  | 1000g | \$300 | $O(nt)$ |
| ↖ |  | 420g  | \$50  |         |
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[Bellman, 1957]

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$t = \underbrace{1500\text{g}}_{\text{max capacity}}$



1000g \$300

$O(nt)$

[Bellman, 1957]



420g \$50

$\tilde{O}(vt)$

[Bateni et al., 2018]



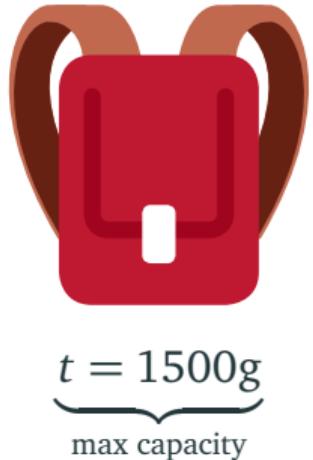
85g \$2

$v = \text{max item value}$



415g \$49

# KNAPSACK



|   |  |       |       |  |   |
|---|--|-------|-------|--|---|
| ↙ |  | 1000g | \$300 | $O(nt)$                                | [Bellman, 1957]                                 |
| ↖ |  | 420g  | \$50  | $\tilde{O}(vt)$                        | [Bateni et al., 2018]                           |
| ↙ |  | 85g   | \$2   | $v = \text{max item value}$<br>$O(st)$ | [Kellerer-Pferschy, 2004]                       |
| ↙ |  | 415g  | \$49  | $s = \text{max item size}$             | [Bateni et al., 2018]<br>[Axiotis-Tzamos, 2019] |

# KNAPSACK



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|---|--|-------|-------|--|---|
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† Essentially optimal, unless Min-Plus Convolution Conjecture fails

[Cygan et al., 2017], [Künnemann et al., 2017]

## CURRENT KNAPSACK ALGORITHMS ARE ESSENTIALLY OPTIMAL, BUT

Theorem: [Cygan et al., 2017], [K  nnemann et al., 2017]

Min-Plus Convolution reduces to Knapsack with  $s, t \in \tilde{\Theta}(n)$

Corollary: No  $O((nt)^{0.99})$  and  $O((st)^{0.99})$  time algorithms for Knapsack,  
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Theorem: [P.-Rohwedder-Węgrzycki, 2021]

Knapsack can be solved in  $O(n + s^3)$  time

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$O(st)$  [Kellerer–Pferschy, 2004]

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~~$O(s^2)$~~   $\underbrace{O(s^{5/3})}$  This work  
additive combinatorics magic\*

\*Unless  $t$  is too small, or (almost) all numbers have a common divisor, the answer is always YES

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**SEE YOU AT THE POSTER!**

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