

# A parameterized approximation scheme for the 2D-Knapsack problem with wide items

Mathieu Mari

University of Warsaw and  
IDEAS-NCBR

Now at LIRMM, Montpellier

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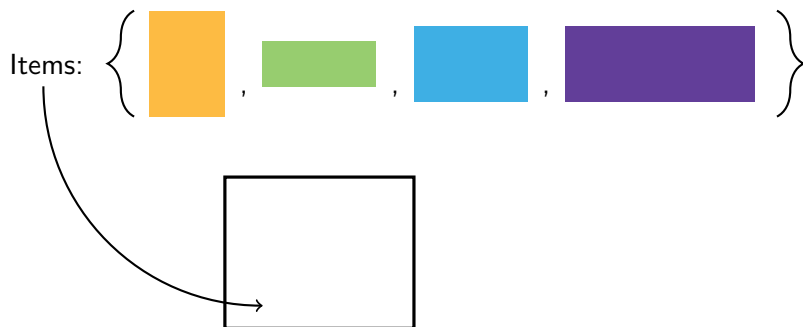
ENS de Lyon

Now at LaBRI, Bordeaux

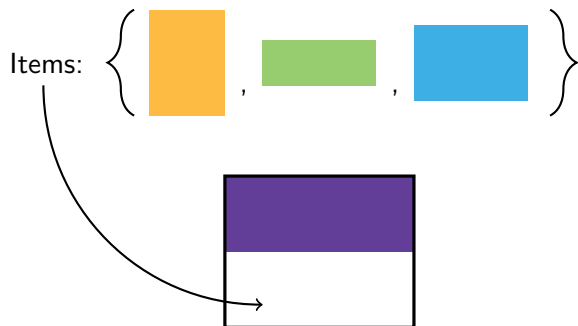
Michał Pilipczuk

University of Warsaw

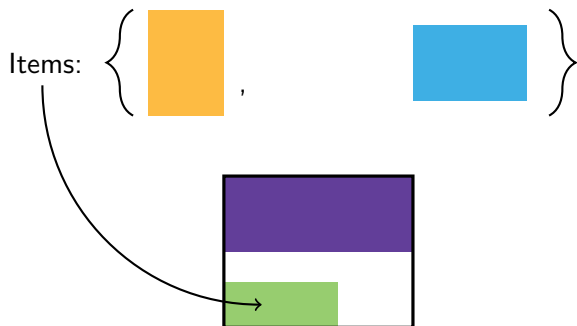
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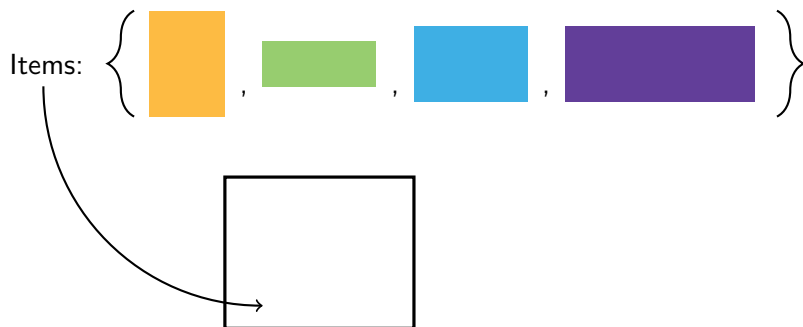
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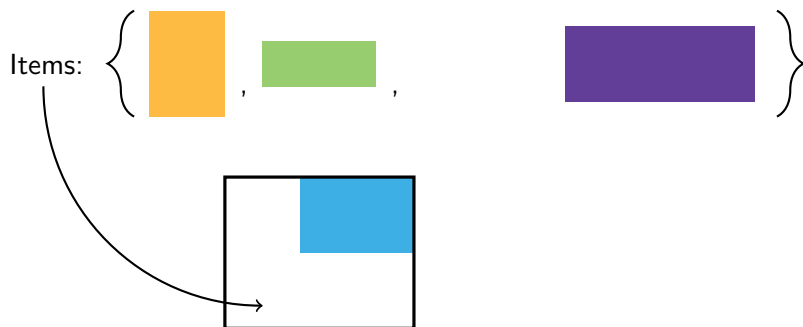
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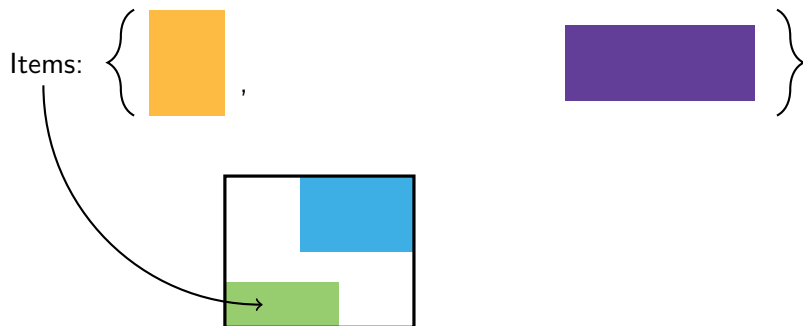
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Items: {  }



✓ You've packed the maximum number of Items!



# What is known about 2D-KNAPSACK?

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- NP-Hard (by reduction to KNAPSACK)

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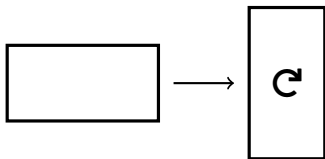
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 Box aspect ratio is bounded by  $\delta$

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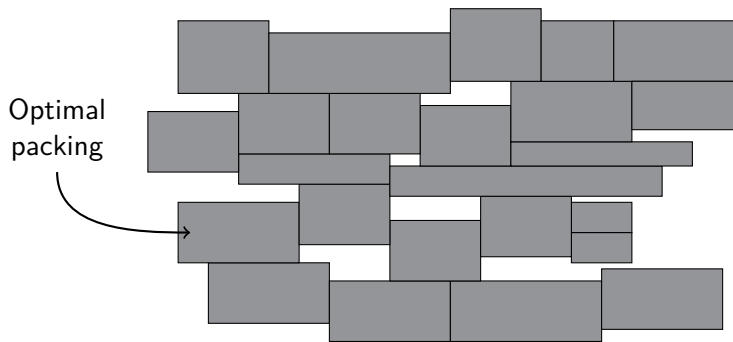
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- 3 Dynamic Programming + color coding  
 $\implies$  find the structured solution

# The structural lemma

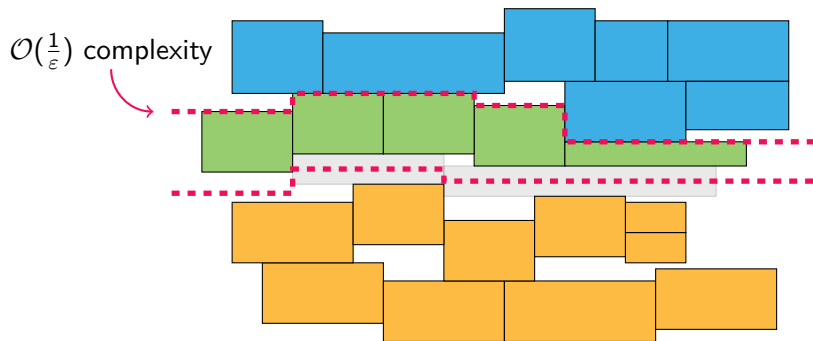
If all rectangles have substantial width, by deleting  $\varepsilon k$  rectangles:





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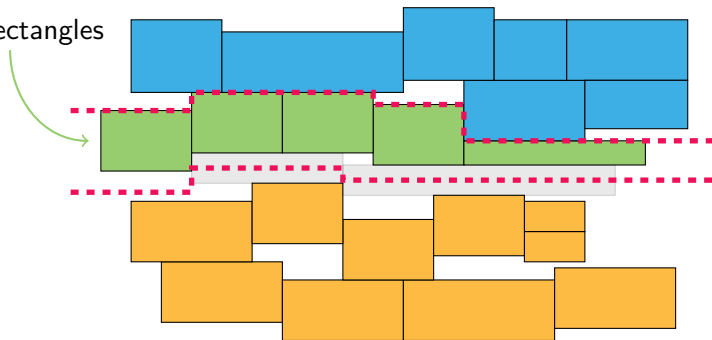
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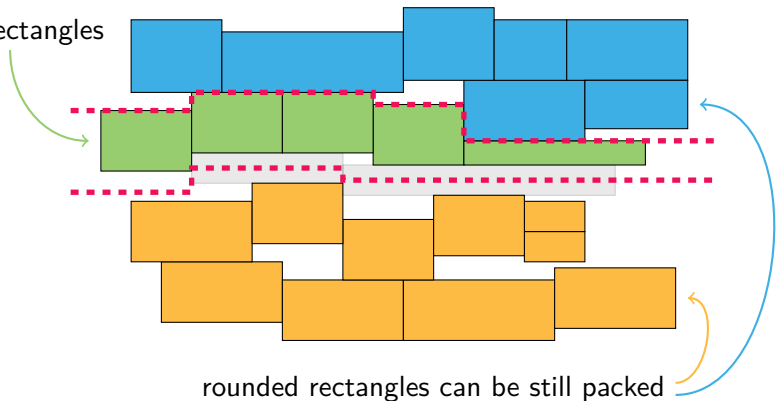
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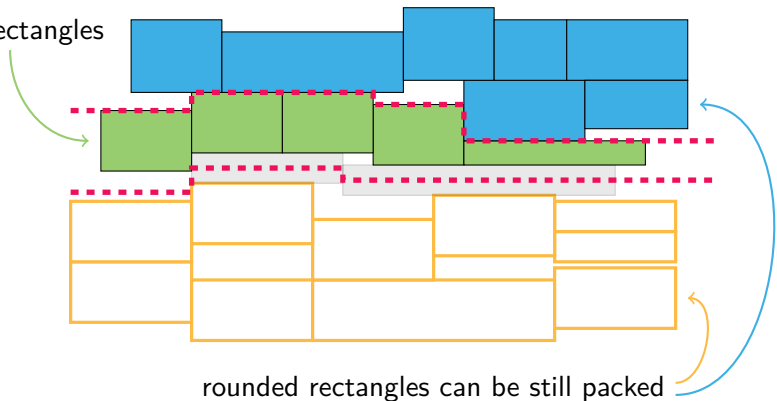


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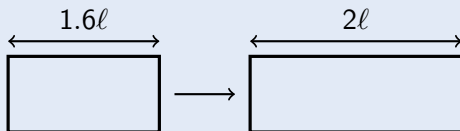
### Definition

Rounding a rectangle to a multiple of  $\ell = N_1/f(k, \delta)$ .

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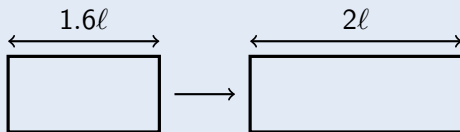
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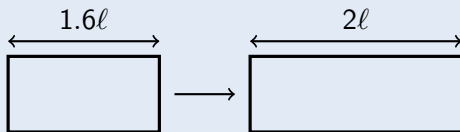
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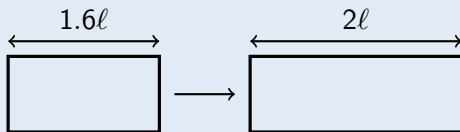
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- 3 Bounded amount of interesting rounded rectangles  $\implies$  brute force.

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↔ *Every rectangle is wide*

📏 *Box aspect ratio is bounded*

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Thanks for listening!