

# Lecture 3: Approximation Algorithms for Packing Problems in Two Dimensions

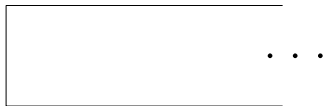
Helmut Alt, Freie Universität Berlin  
at 10th Winter School on Computational Geometry  
Amirkabir University of Technology, Tehran

2 March 2018

# Strip Packing

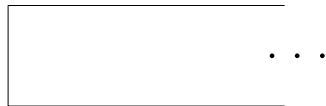
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Consider a **strip**  $S$  of fixed height.

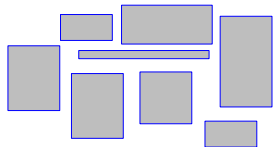


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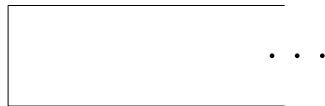


**Given:** A set  $\mathcal{O}$  of axes-parallel rectangles.

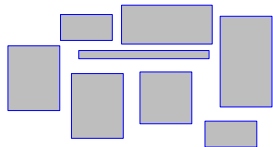


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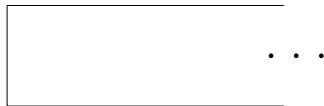
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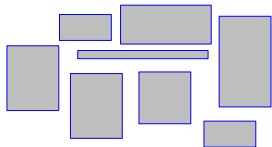
**Determine:** Packing of  $\mathcal{O}$  into  $S$  of minimum length.

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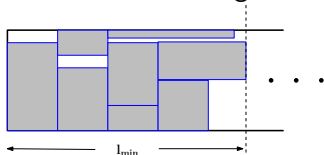
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both are **approximation algorithms with factors 3 and 2.7** for FF and NF, respectively !

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Let  $h_0$  be the minimum height of the rectangles,  $H$  the sum of all heights.

1. Apply the approximative strip packing algorithm to strips of heights  $h_0, \dots, h_k$ , where  $h_i = h_0(1 + \delta)^i$  and  $k$  the smallest integer such that  $h_k \geq H$ .



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2. Keep track of the rectangle areas obtained in step 1 and return the rectangle and packing achieving the minimum of these areas.

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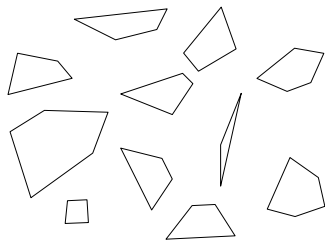
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- ▶ The best approximation algorithm for strip packing known achieves a factor of  $5/3 + \varepsilon$  for any  $\varepsilon > 0$  (Harren et al. 2014).
- ▶ For any  $\varepsilon > 0$  there is an  $5/3 + \varepsilon$ -approximation algorithm for finding the smallest a.p. rectangle for packing a given set of rectangles under translation.

# Convex Polygons Under Translation

(Alt, de Berg, Knauer, JOCG 2017)

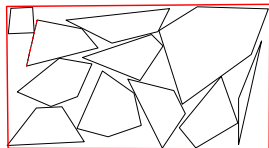
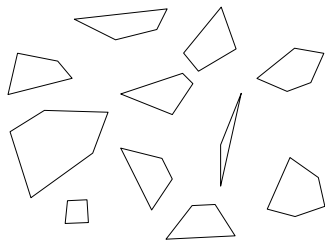
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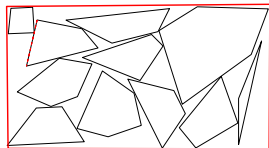
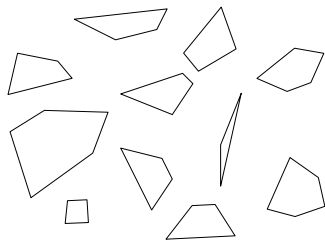
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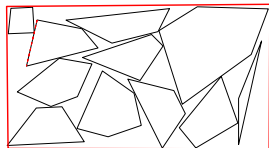
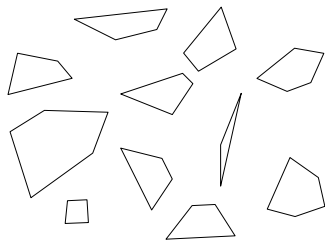
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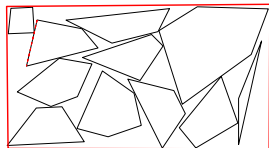
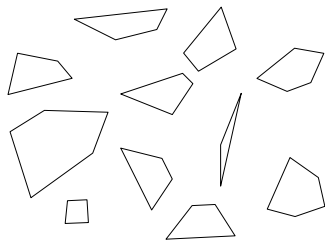
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# Algorithm for axis-parallel rectangular containers

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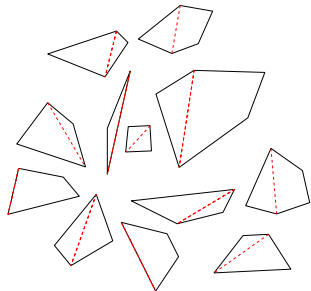
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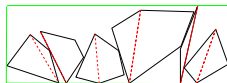
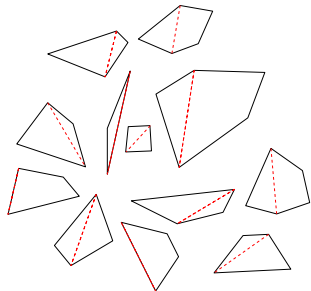
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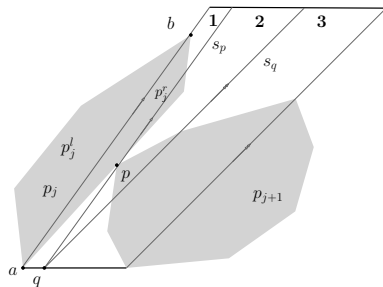
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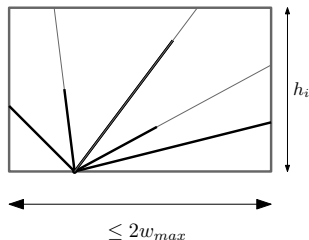
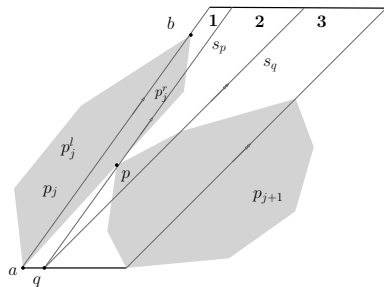


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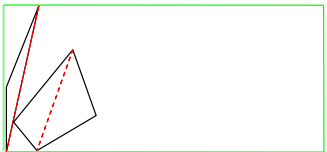
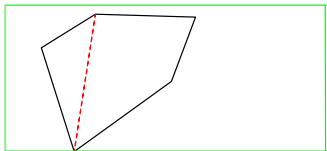
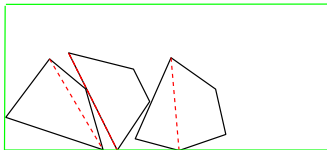
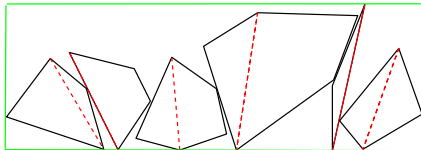
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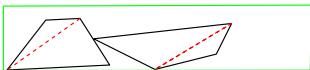
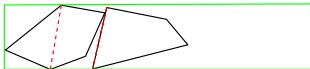
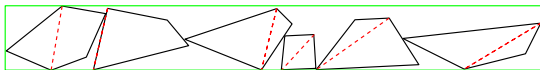
gives an approximation factor of  $f(\alpha, c) = \left(1 + \frac{1}{c}\right) \cdot \frac{2+c\alpha}{\alpha-\alpha^2}$

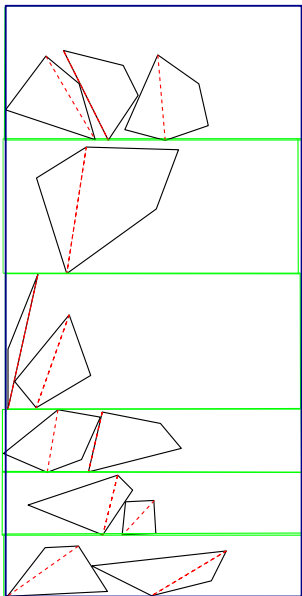
this is optimal for  $\alpha = 0.407\dots, c = 2.214\dots$ , namely 17.449...

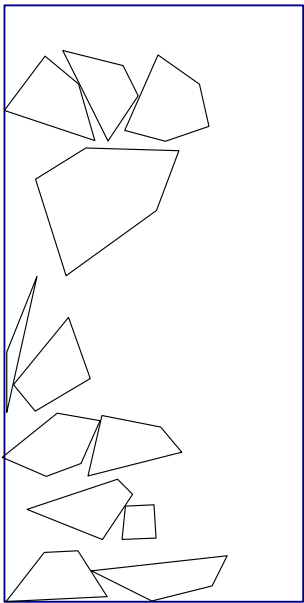
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2. Use the previous algorithm with respect to orientation  $\phi$ .

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