



UNIVERSITÄT ZU LÜBECK

Fully Dynamic Bin Packing Revisited

*Sebastian Berndt*¹ *Klaus Jansen*² *Kim-Manuel Klein*²

¹Institut für Theoretische Informatik, Universität zu Lübeck

²Department of Computer Science, Christian-Albrechts-University to Kiel



Fully Dynamic Bin Packing =
Online + Removal + Repacking

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INS: $a/0.2$

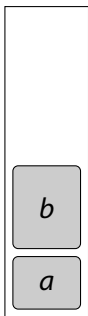
Fully Dynamic Bin Packing = Online + Removal + Repacking

INS: $a/0.2$, **INS:** $b/0.3$



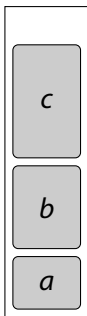
Fully Dynamic Bin Packing = Online + Removal + Repacking

INS: $a/0.2$, **INS:** $b/0.3$, **INS:** $c/0.4$



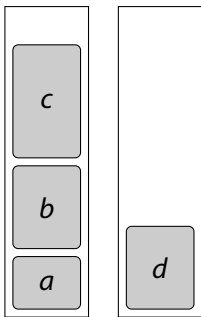
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INS: $a/0.2$, **INS:** $b/0.3$, **INS:** $c/0.4$, **INS:** $d/0.2$



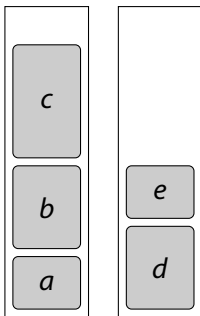
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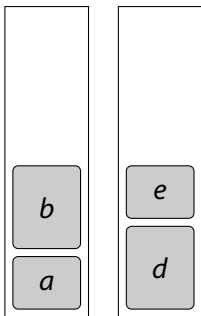
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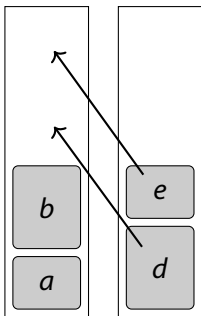
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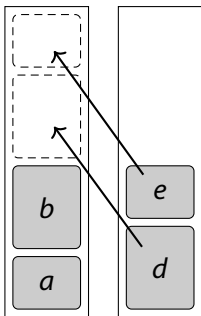
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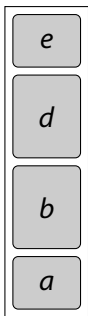
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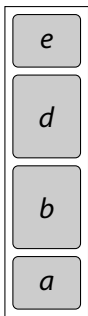
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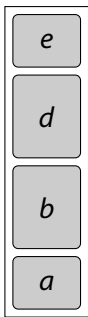
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$$\text{Migration Factor}_t = \frac{\begin{array}{c} \boxed{d} \\ + \\ \boxed{e} \end{array}}{\boxed{c}} = \frac{\text{SIZE(moved)}}{\text{SIZE(new/removed)}}$$

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Shifting Moves = number of moved items

Lower Bound

Migration Factor of $\Omega(1/\varepsilon)$ is necessary for ratio $1 + \varepsilon$

$L = 1/2 - 1/9(\text{Migration Factor})$, $S = 1/3(\text{Migration Factor})$

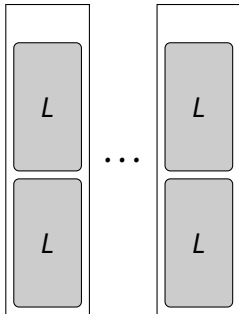
INS: L , INS: L , INS: L , ...

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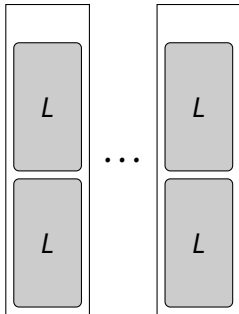
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INS: S , INS: S , INS: S , ...



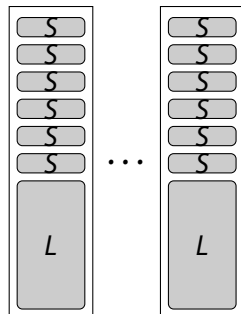
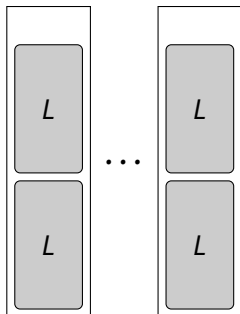
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INS: S , INS: S , INS: S , ...



Online Bin Packing with Repacking

Known Results on upper bounds

Ratio	REM?	Shifting M.	Migration F.	Authors
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Online Bin Packing with Repacking

Known Results on upper bounds

Ratio	REM?	Shifting M.	Migration F.	Authors
3/2	X	3	X	Gambosi, Postiglione, Talamo (2000)
4/3	X	7	X	Gambosi, Postiglione, Talamo (2000)

Online Bin Packing with Repacking

Known Results on upper bounds

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3/2	X	3	X	Gambosi, Postiglione, Talamo (2000)
4/3	X	7	X	Gambosi, Postiglione, Talamo (2000)
$1 + \varepsilon$	X	$\text{poly}(\log n)$ [am.]	X	Ivković, Lloyd (1997)
$1 + \varepsilon$	X	$2^{\text{poly}(1/\varepsilon)}$	$2^{\text{poly}(1/\varepsilon)}$	Epstein, Levin (2006)
$1 + \varepsilon$	X	$\mathcal{O}(1/\varepsilon^4)$	$\mathcal{O}(1/\varepsilon^4)$	Jansen, Klein (2013)

Online Bin Packing with Repacking

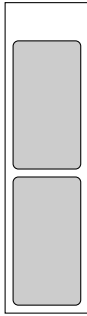
Known Results on upper bounds

Ratio	REM?	Shifting M.	Migration F.	Authors
3/2	✗	3	✗	Gambosi, Postiglione, Talamo (2000)
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5/4	✓	$\text{poly}(\log n)$ [am.]	✗	Ivković, Lloyd (1998)
$1 + \varepsilon$	✓	$\mathcal{O}(1/\varepsilon^4 \log(1/\varepsilon))$	$\mathcal{O}(1/\varepsilon^4 \log(1/\varepsilon))$	this work

An Overview on the Packing

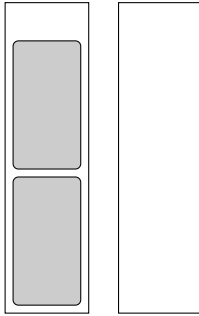


An Overview on the Packing



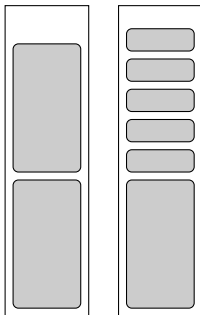
Large

An Overview on the Packing



Large

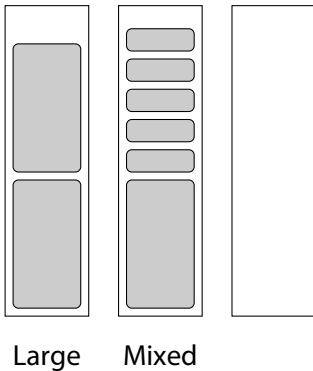
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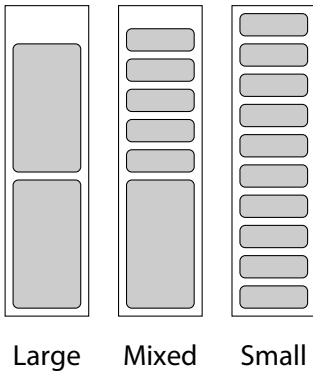
Large

Mixed

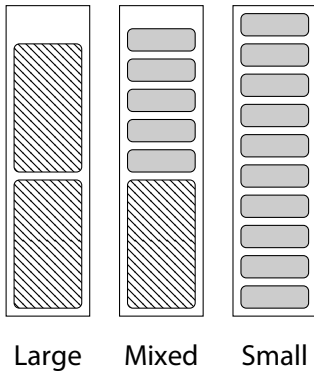
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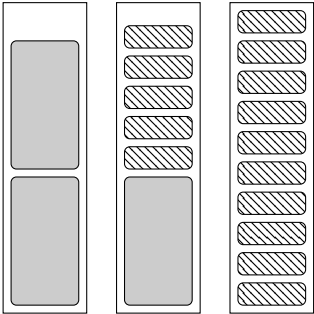


An Overview on the Packing



■ Pack via LP

An Overview on the Packing



Large

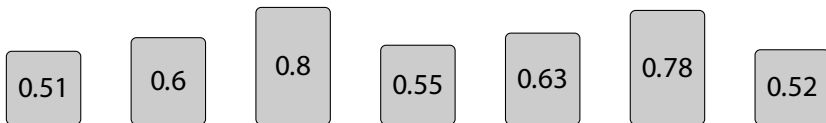
Mixed

Small

- Pack via LP
- Pack via "Sorting"

Rounding Large Items Geometrically

1. Find items of size $(0.5, 1]$



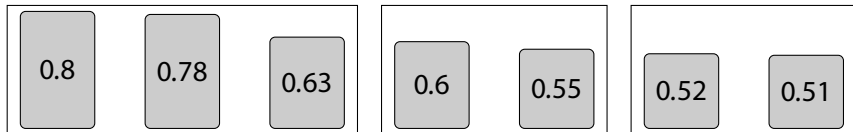
Rounding Large Items Geometrically

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2. Sort items by size



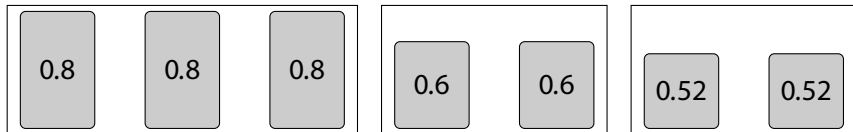
Rounding Large Items Geometrically

1. Find items of size $(0.5, 1]$
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3. **Group items in lists**



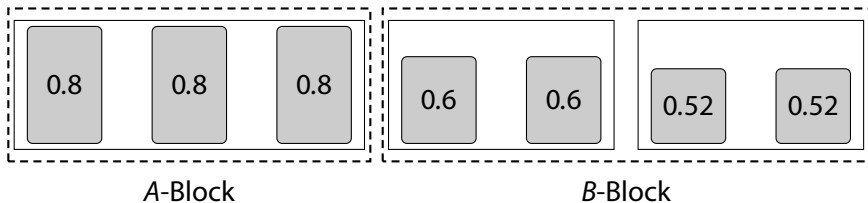
Rounding Large Items Geometrically

1. Find items of size $(0.5, 1]$
2. Sort items by size
3. Group items in lists
4. Round items

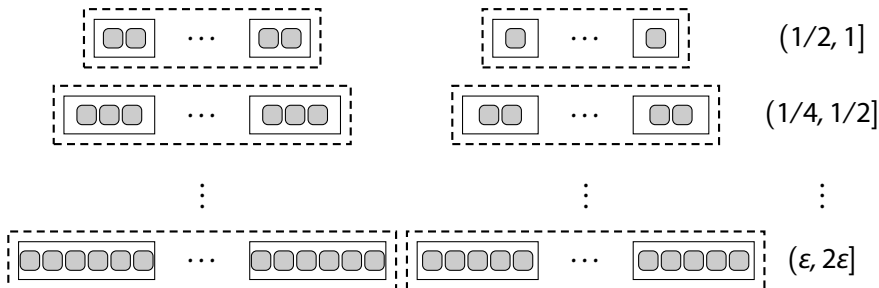


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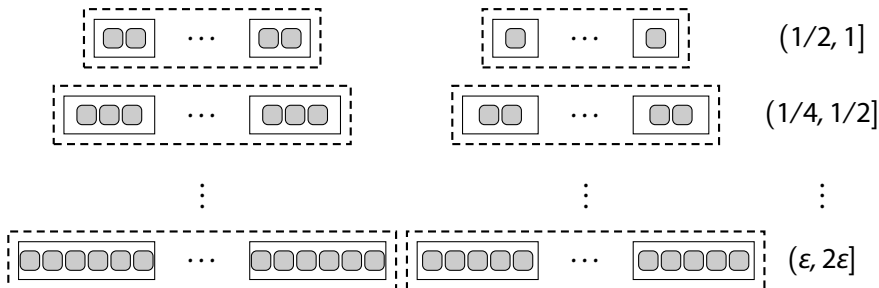


Packing Large Items



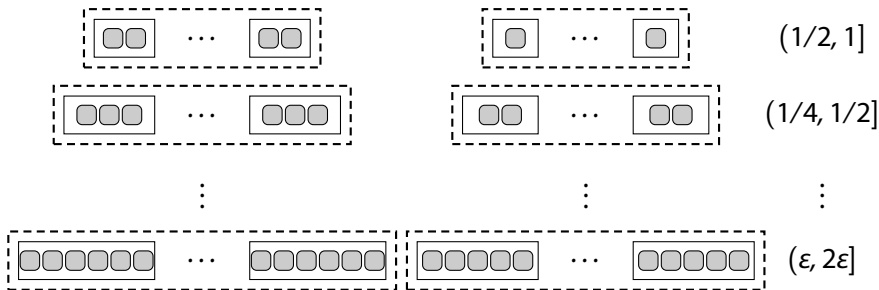
■ Pack rounded items via LP

Packing Large Items

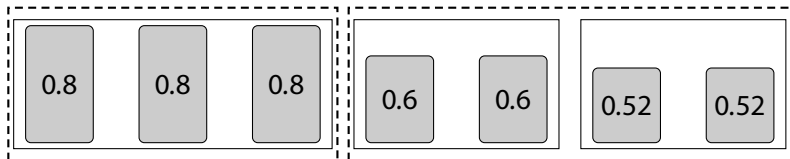


- Pack rounded items via LP
- Size of lists depends on volume of instance \Rightarrow Shifting

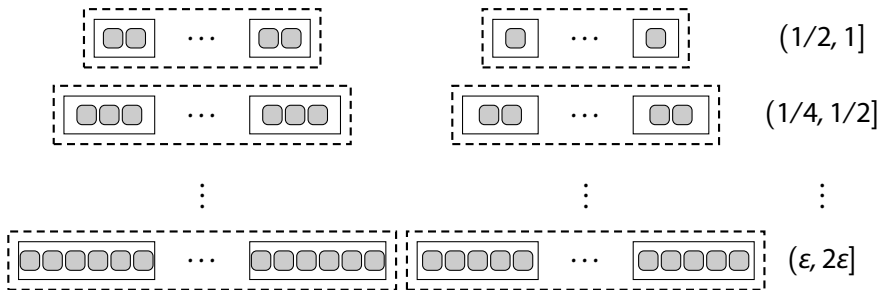
Packing Large Items



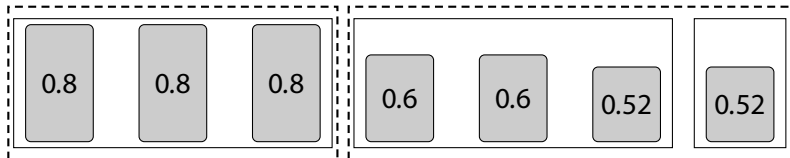
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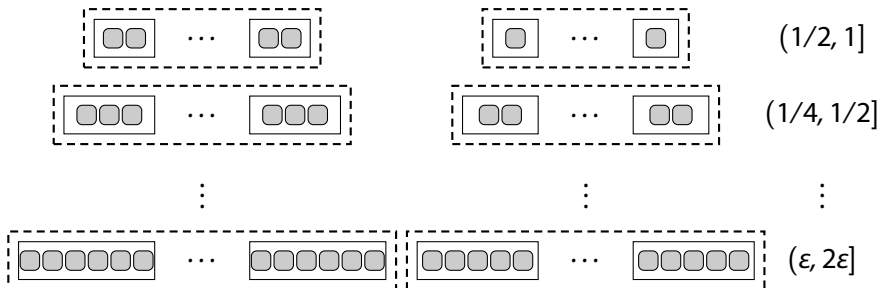
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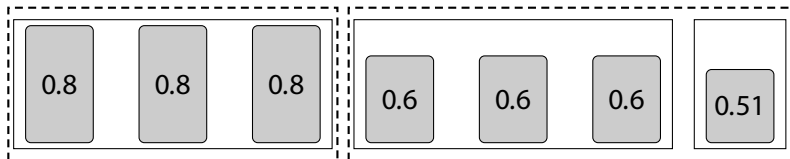
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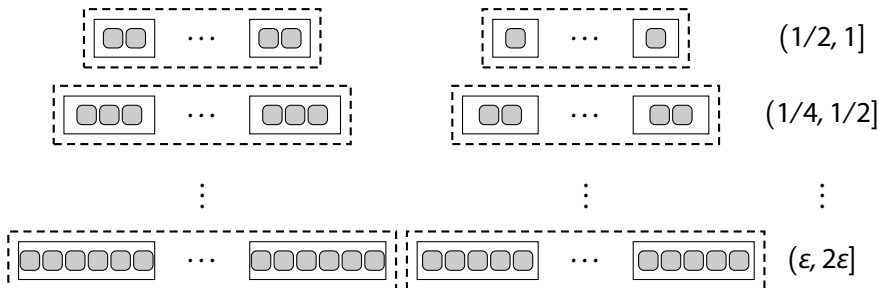
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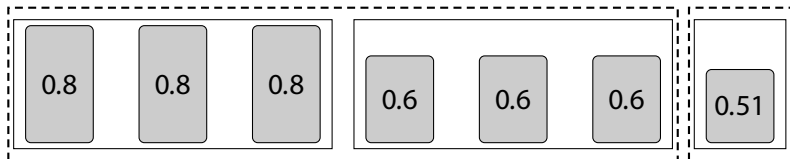
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Packing Small Items is Difficult

Greedy fails: $\varepsilon \gg L \gg S$

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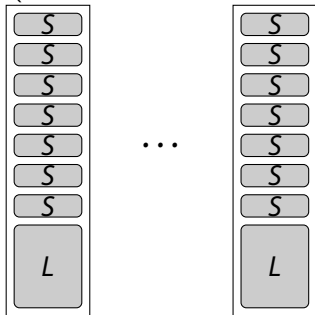
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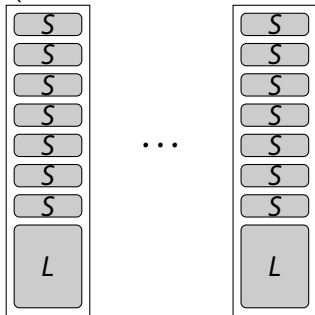
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(INS: L , INS: S , ... , INS: S)^{*}

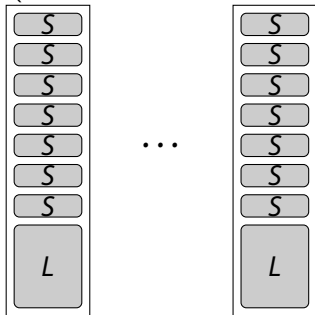


REM: S , REM: S , ...

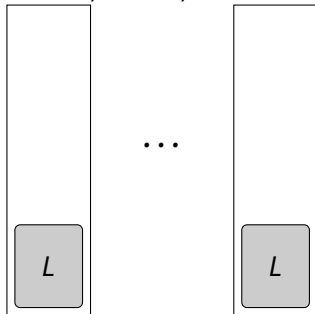
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Packing Small Items via Sorting

Idea: “Sort” small items from left to right

Packing Small Items via Sorting

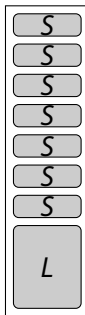
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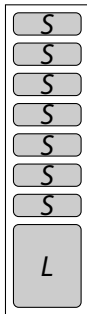
INS: L , INS: S , . . . , INS: S ,



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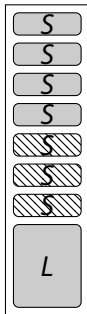
INS: L , INS: S , . . . , INS: S , INS: L



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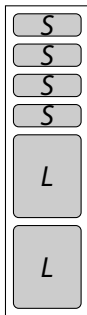
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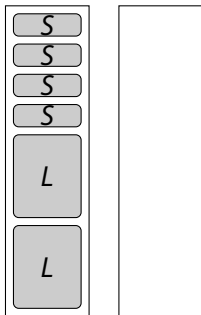
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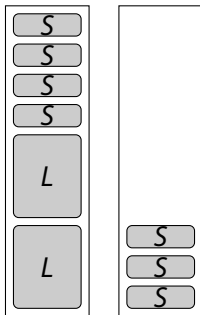
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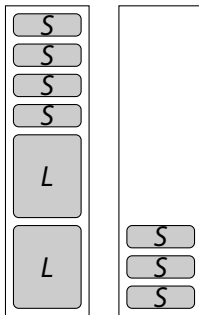
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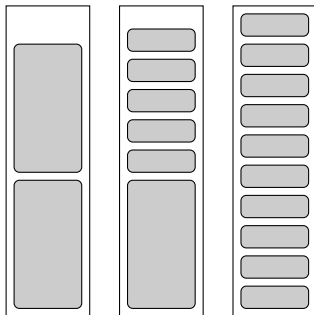
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INS: L , INS: S , . . . , INS: S , INS: L



Stop at every $1/\epsilon$ -th bin (buffer bin) to bound Migration

An Overview on the Packing



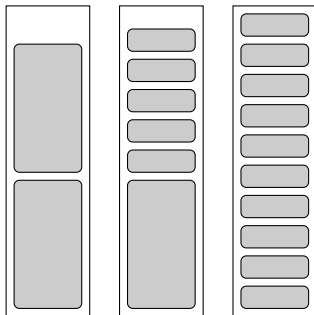
Large

Mixed

Small

- Pack large items via LP

An Overview on the Packing



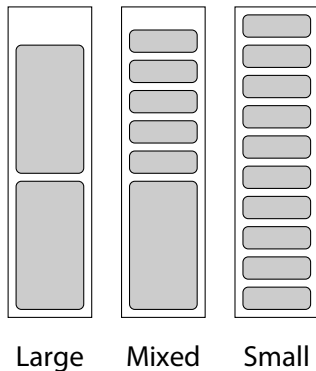
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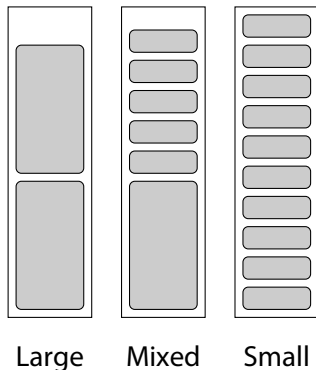
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An Overview on the Packing



- Pack large items via LP
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- Small bins \Rightarrow little free space in other bins

An Overview on the Packing



- Pack large items via LP
- Pack small items via "Sorting"
- Small bins \Rightarrow little free space in other bins
- **Relate nearly full/empty bins via potential function**

Questions Left

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(**REM**-operation, $\omega(1)$ sizes)

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- Can we simplify the handling of the small items?
- Can we adapt our techniques to other problems?