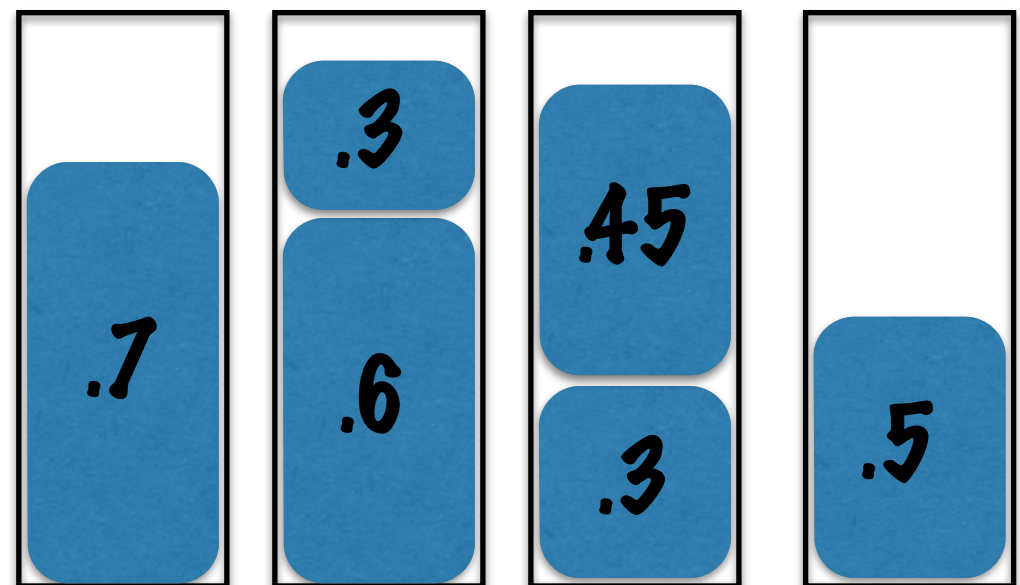
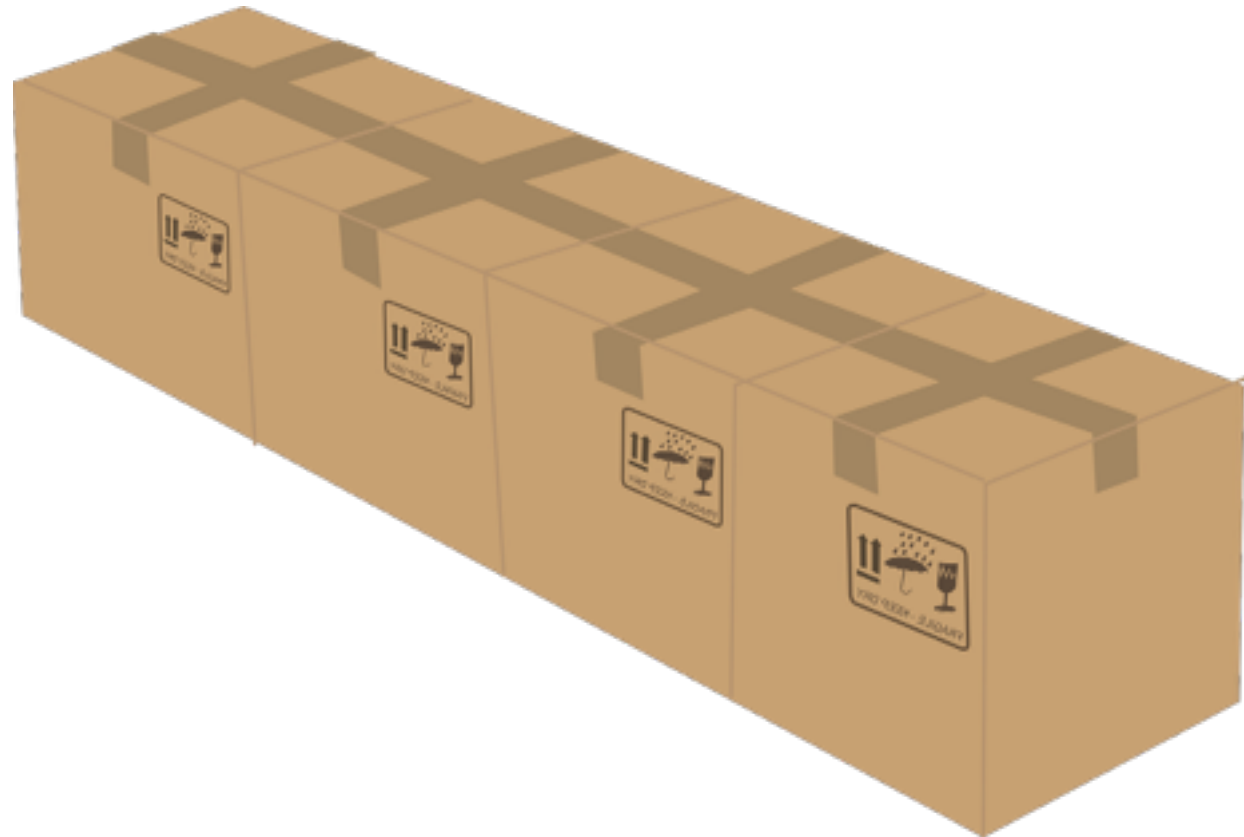


# Bin packing, linear programming and rounding



Can we do better than  
Next Fit?

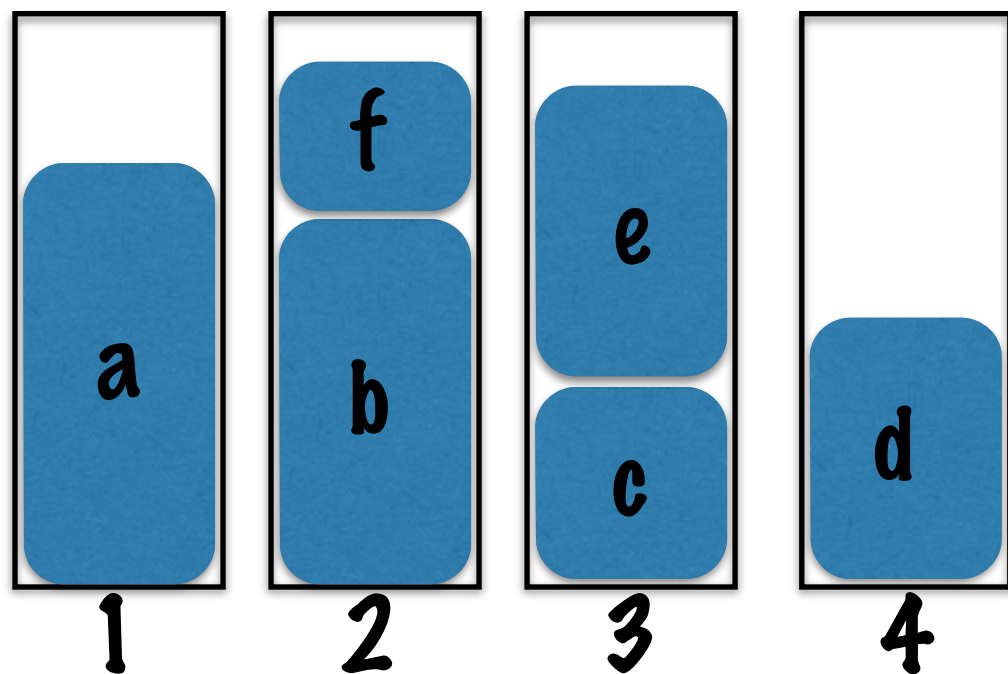
**First tool: linear programming  
relaxation**

# An integer program

Given  $n$  items and  $K$  unit bins,  
is there a packing?

**Variables:**  $x_{ij} \in \{0, 1\}$

$x_{ij} = 1$  iff item  $i$  is placed in bin  $j$



$$x_{a1} = x_{b2} =$$

$$x_{f2} = x_{c3} =$$

$$x_{e3} = x_{d4} = 1,$$

$$x_{ij} = 0 \text{ otherwise}$$

# An integer program

**Constraint: every item  
must go somewhere**

**Item  $b$  must go into bin 1,2,3 or 4**

$$x_{b1} + x_{b2} + x_{b3} + x_{b4} = 1$$

# An integer program

**Constraint: must not  
exceed bin capacity**

**Item sizes in bin  $j$  sum to at most 1.**

$$x_{aj}s_a + x_{bj}s_b + \cdots + x_{fj}s_f \leq 1$$

# Integer program

$n$  items,  $K$  bins

$x_{ij}$  = whether item  $i$  goes into bin  $j$

$$\forall i : \sum_j x_{ij} = 1$$

$$\forall j : \sum_i x_{ij} s_i \leq 1$$

$$\forall i, j : x_{ij} \in \{0, 1\}$$

feasible iff items can be packed into  $K$  bins

# Linear programming relaxation

$n$  items,  $K$  bins

$$\forall i : \sum_j x_{ij} = 1$$

$$\forall j : \sum_i x_{ij} s_i \leq 1$$

$$\forall i, j : 0 \leq x_{ij} \leq 1$$

**Algorithm: use the LP relaxation  
to pack items (somehow)**

**How good is the relaxation?**

# A bad example

$n$  items,  $K$  bins

$$\forall i : \sum_j x_{ij} = 1$$

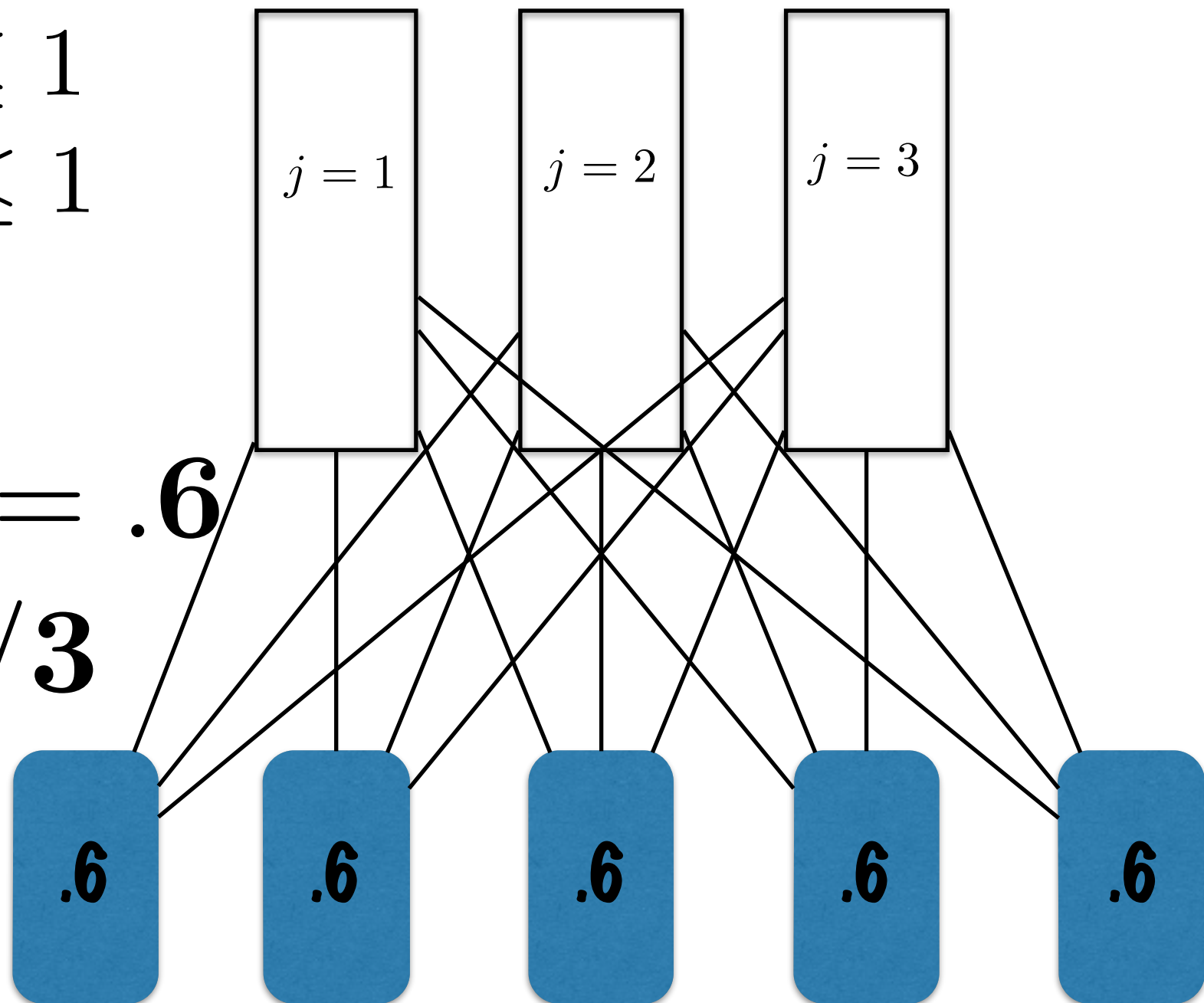
$$\forall j : \sum_i x_{ij} s_i \leq 1$$

$$\forall i, j : 0 \leq x_{ij} \leq 1$$

$$s_1 = \dots = s_5 = .6$$

$$\forall i, j \quad x_{ij} = 1/3$$

**LP: 3 bins**  
**OPT: 5 bins**





# Bin packing, linear programming and rounding

