

The Subset Sum Game Revisited

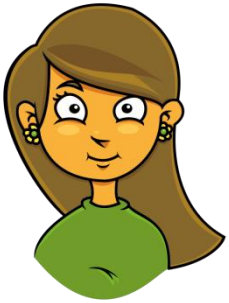
Astrid Pieterse¹ and Gerhard J. Woeginger²

¹ Eindhoven University of Technology

² RWTH Aachen

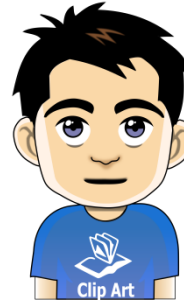
The Subset Sum Game

Alice



Items a_1, \dots, a_n

Bob



Items b_1, \dots, b_m

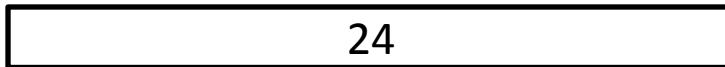
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Bob

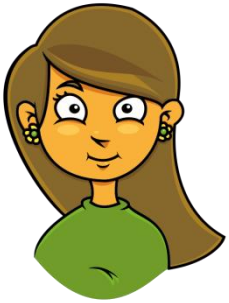


Knapsack



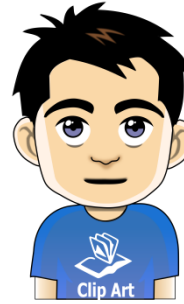
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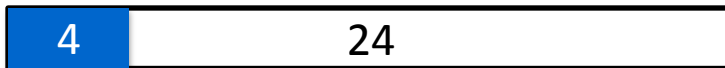
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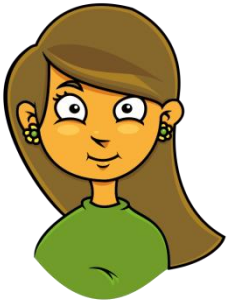


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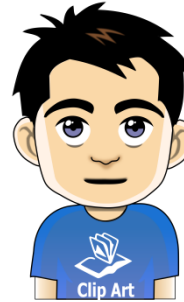
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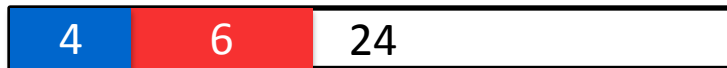
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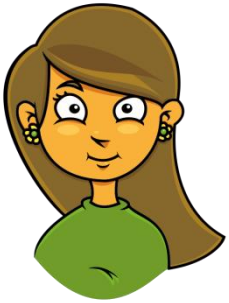


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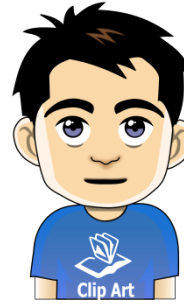
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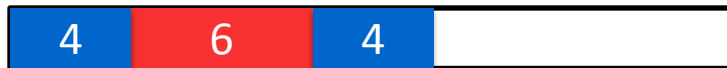
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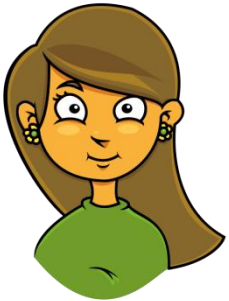


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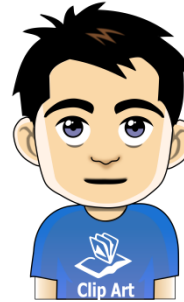
The Subset Sum Game

Alice



Items a_1, \dots, a_n

Bob



Items b_1, \dots, b_m

Alice

11

Bob

7

4

7

Knapsack

4

6

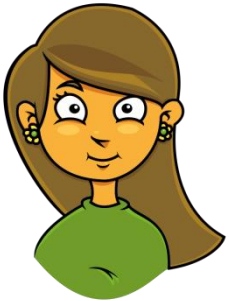
4

6



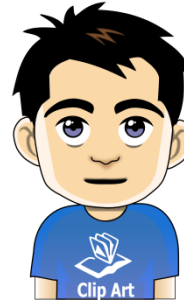
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Items b_1, \dots, b_m

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Bob

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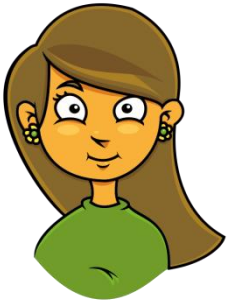
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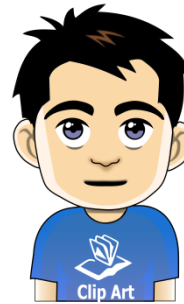
The Subset Sum Game

Alice



Items a_1, \dots, a_n

Bob



Items b_1, \dots, b_m

Alice

11

Pass

Bob

7

7

Knapsack

4

6

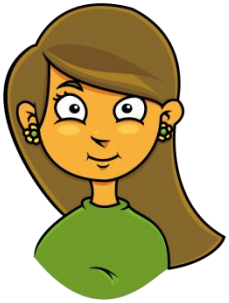
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6

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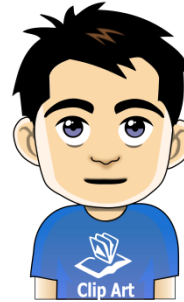
The Subset Sum Game

Alice



Items a_1, \dots, a_n

Bob



Items b_1, \dots, b_m

Alice

11

Pass

Bob

7

7

Pass

Knapsack

4

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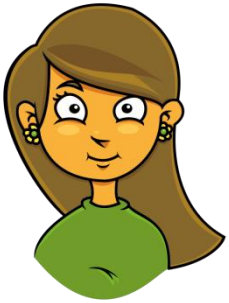
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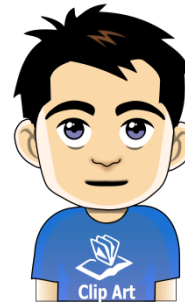
The Subset Sum Game

Alice



Items a_1, \dots, a_n

Bob



Items b_1, \dots, b_m

Alice: 12

Bob: 12

Alice

11

Pass

Bob

7

7

Pass

Knapsack

4

6

4

6

4

Motivation

Players compete over a resource

- Processing time
- Bandwidth
- ...

Player strategies

Players know

- Other player's goal
- Items

We will be Alice

- Goal: Maximize our weight (Selfish)

Strategies for Bob

Strategies for Bob

- Selfish

Result A

Result B

- Hostile

- Greedy

Strategies for Bob

Strategies for Bob

- Selfish

	Result A		Result B
Alice	6	Alice	7
Bob	4	Bob	6

- Hostile

- Greedy

Strategies for Bob

Strategies for Bob

- Selfish

Result A

Alice	6
Bob	4

Result B

Alice	7
Bob	6



- Hostile

- Greedy

Strategies for Bob

Strategies for Bob

- Selfish

Result A

Alice	6
Bob	4

Result B

Alice	7
Bob	6



- Hostile

Alice	6
Bob	4

Alice	7
Bob	6

- Greedy

Strategies for Bob

Strategies for Bob

- Selfish

	Result A		Result B
Alice	6	Alice	7 ✓
Bob	4	Bob	6

- Hostile

Alice	6 ✓	Alice	7
Bob	4	Bob	6

- Greedy

Strategies for Bob

Strategies for Bob

- Selfish

	Result A		Result B
Alice	6	Alice	7 ✓
Bob	4	Bob	6

- Hostile

Alice	6 ✓	Alice	7
Bob	4	Bob	6

- Greedy

- Play the largest item that fits

Hostile – Selfish

Alice plays selfish

- Does it matter if Bob is selfish or hostile?

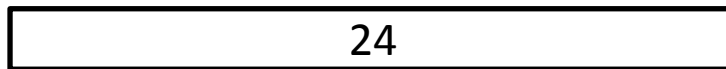
Alice



Bob



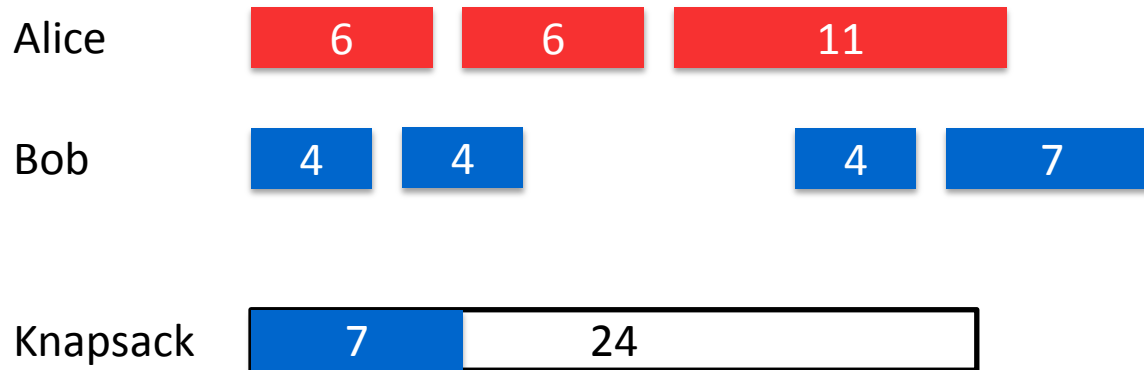
Knapsack



Hostile – Selfish

Alice plays selfish

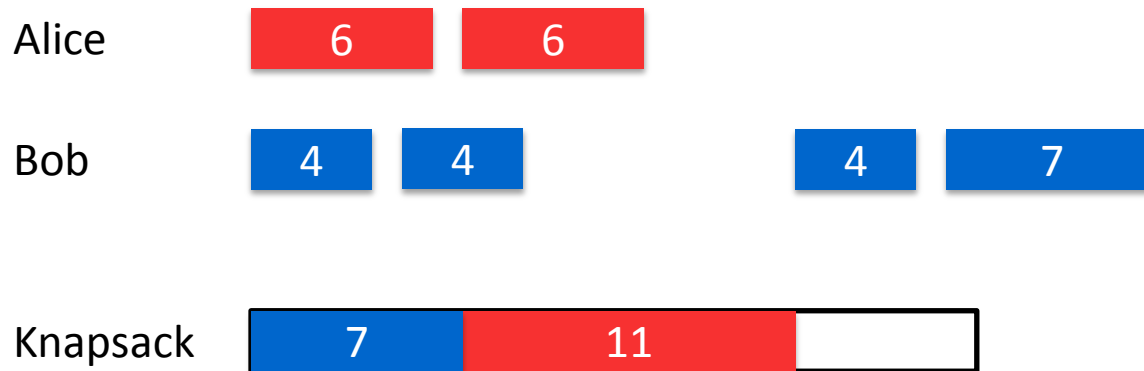
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Hostile – Selfish

Alice plays selfish

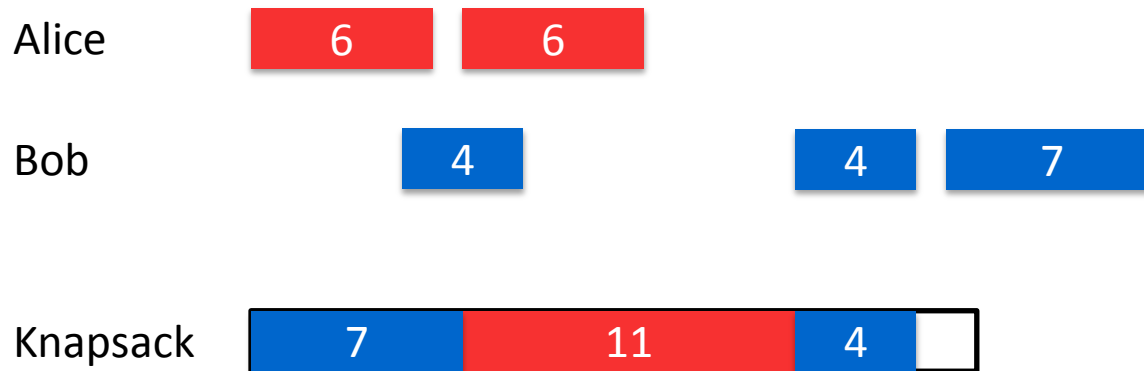
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Hostile – Selfish

Alice plays selfish

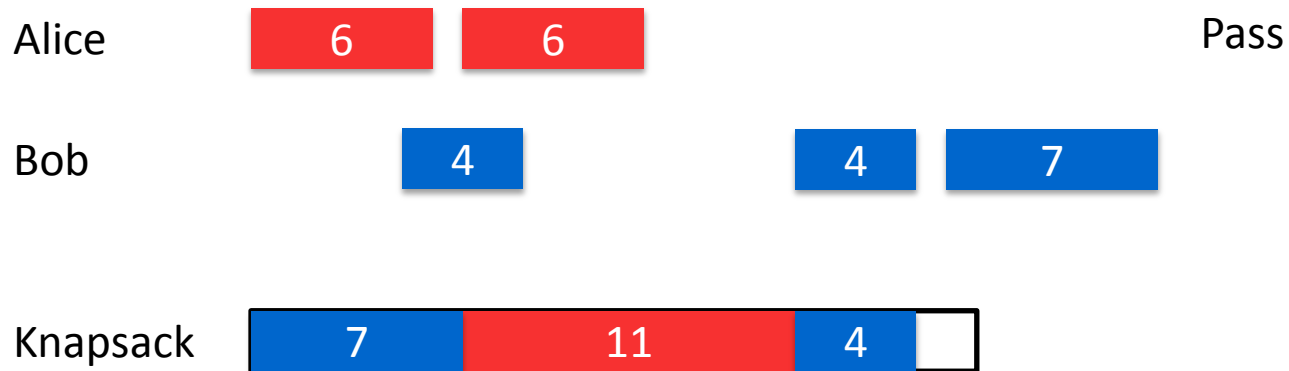
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Hostile – Selfish

Alice plays selfish

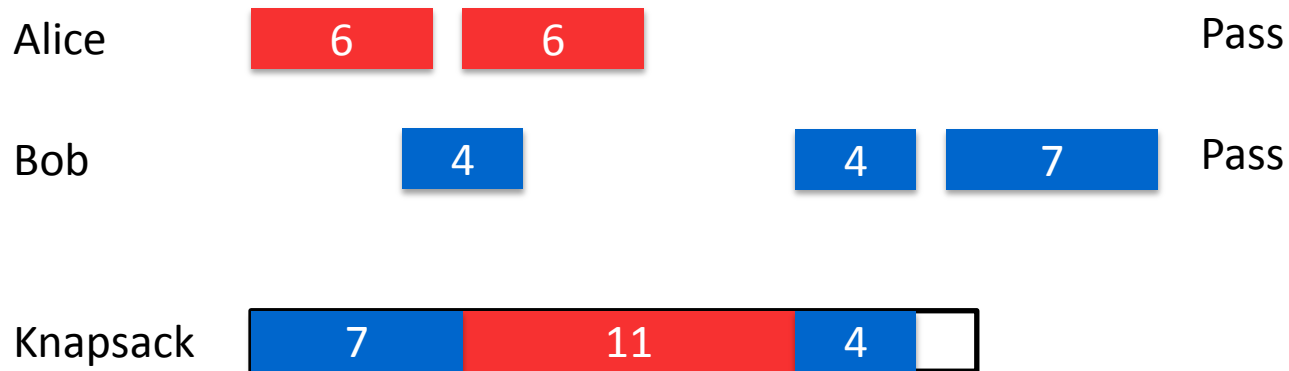
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Hostile – Selfish

Alice plays selfish

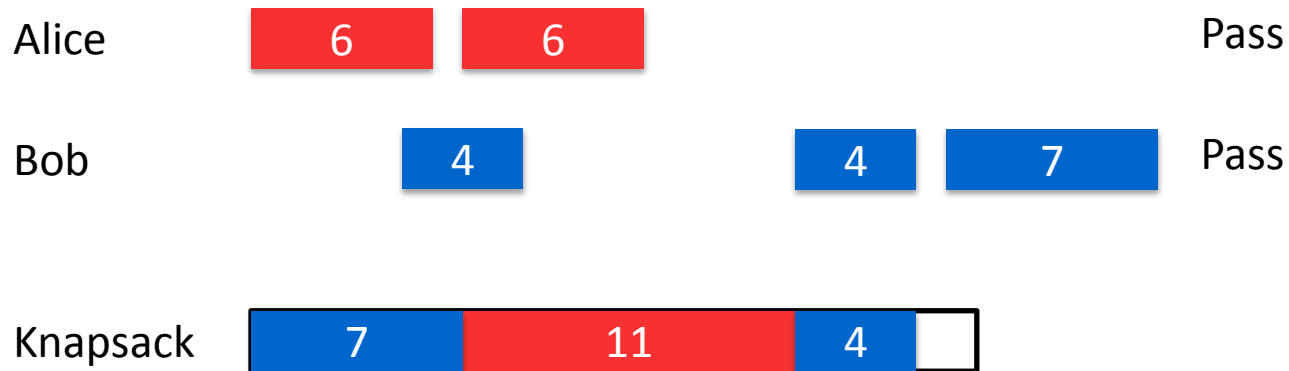
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Hostile – Selfish

Alice plays selfish

- Does it matter if Bob is selfish or hostile?

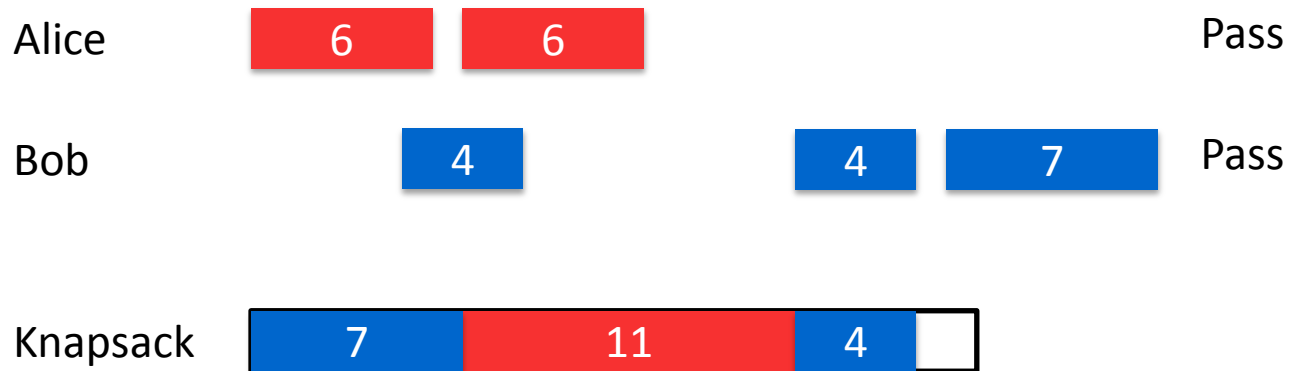


Result: Alice: 11, Bob: 11

Hostile – Selfish

Alice plays selfish

- Does it matter if Bob is selfish or hostile?



Result: Alice: 11, Bob: 11

Previously: Alice: 12, Bob: 12

Previous work

Introduced by

Darmann, Nicosia, Pferschy & Schauer

Greedy strategy [Darmann et al.]

- Gives **at least $1/2$** the maximum weight
- Greedy with lookahead

Optimal strategy against selfish Bob may pack **smaller items before larger** items [Darmann et al.]

- But not against greedy
- Packs items in non-increasing order

Our results

SSG against hostile/selfish

- *PSPACE* complete
- No α -approximation unless $P = NP$

SSG against greedy

- Solvable in pseudo polynomial time
- Has a PTAS
- Has no FPTAS unless $P = NP$

PTAS against greedy player

Definition: PTAS

Polynomial time approximation scheme

- Trade-off: running time - approximation factor

Algorithm that for given $\varepsilon > 0$

- Finds strategy for Alice
 - with value at least $(1 - \varepsilon) * OPT$
- Runs in polynomial time in n for ε constant
 - $O(n^{1/\varepsilon})$ allowed

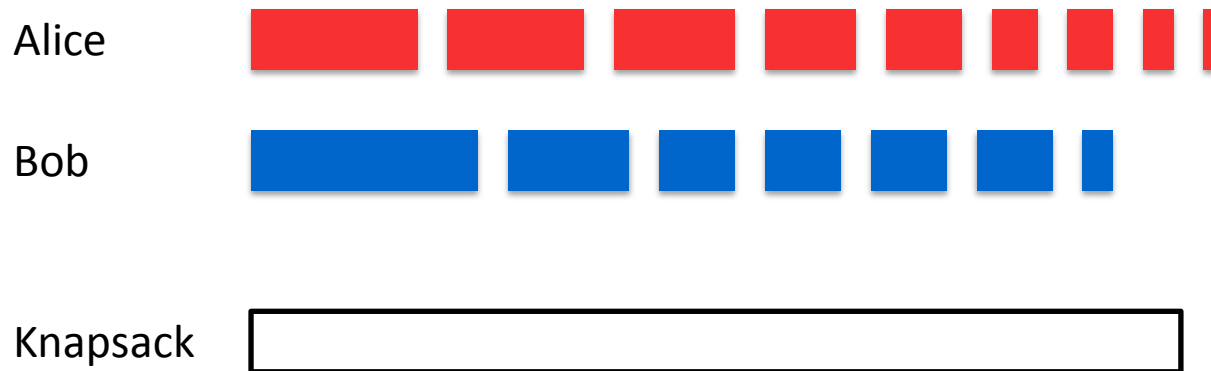
PTAS against greedy

Idea

- Pack in **non-increasing order**
- Try **all possibilities** to pack the first few items
 - Large items are important
- Pack smaller items **greedily**
- Choose the best strategy

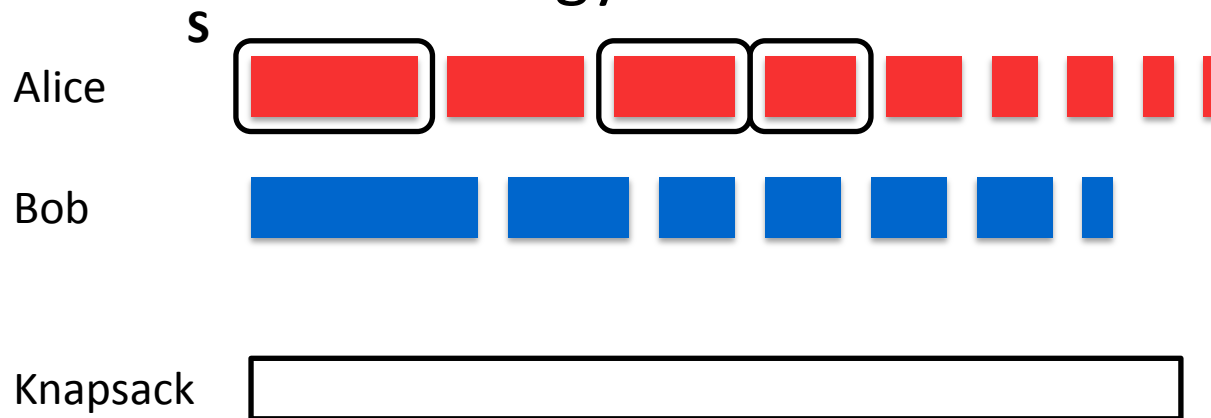
PTAS

- For each $S \subseteq$ Alice-items with $|S| \leq 1/\varepsilon$
 - Choose items of S large to small
 - Continue greedily
- If impossible to pack S
 - Discard
- Pick the best strategy



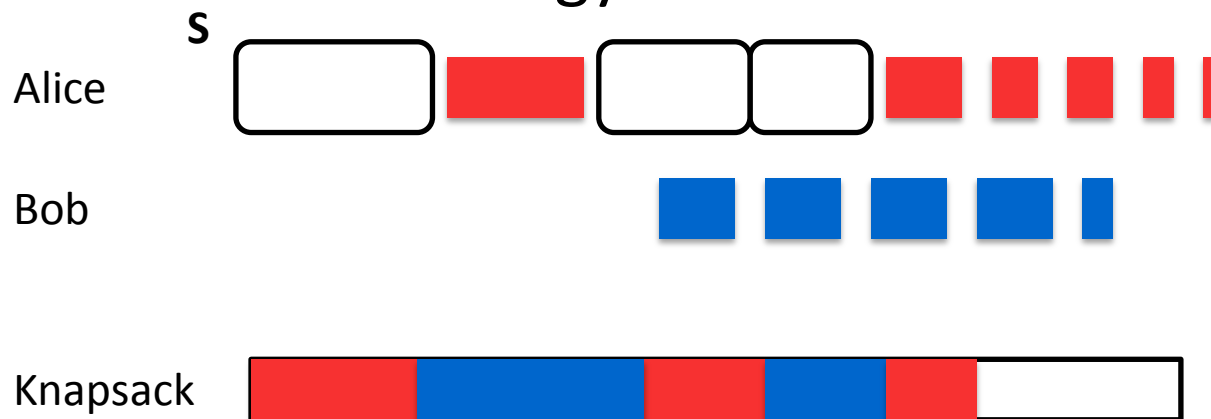
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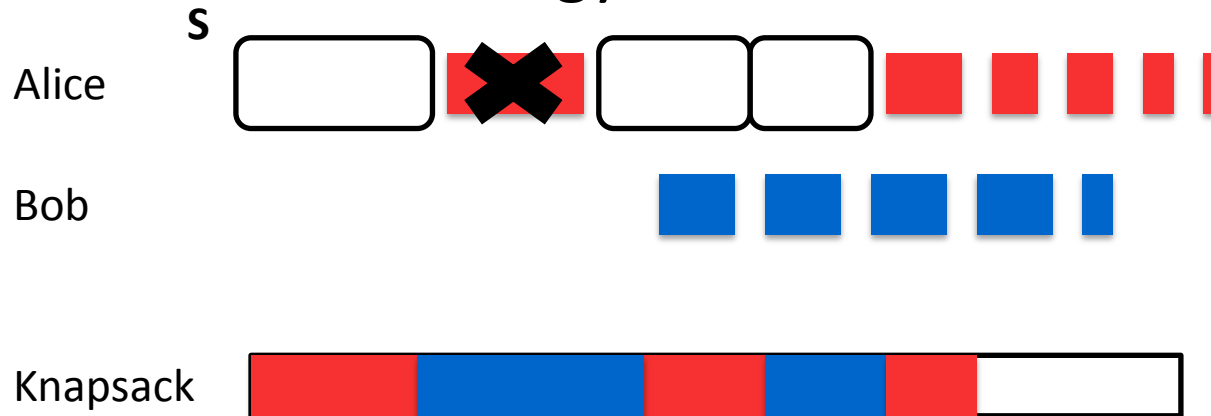
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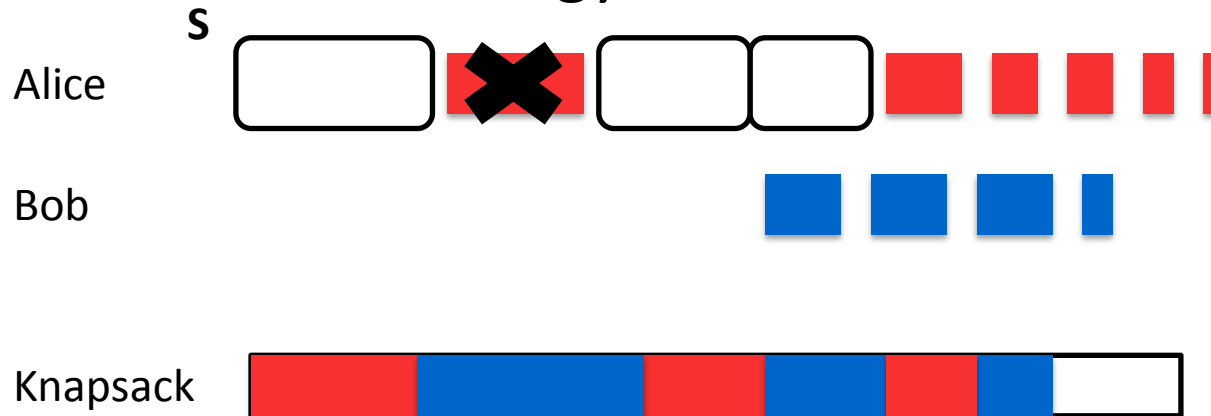
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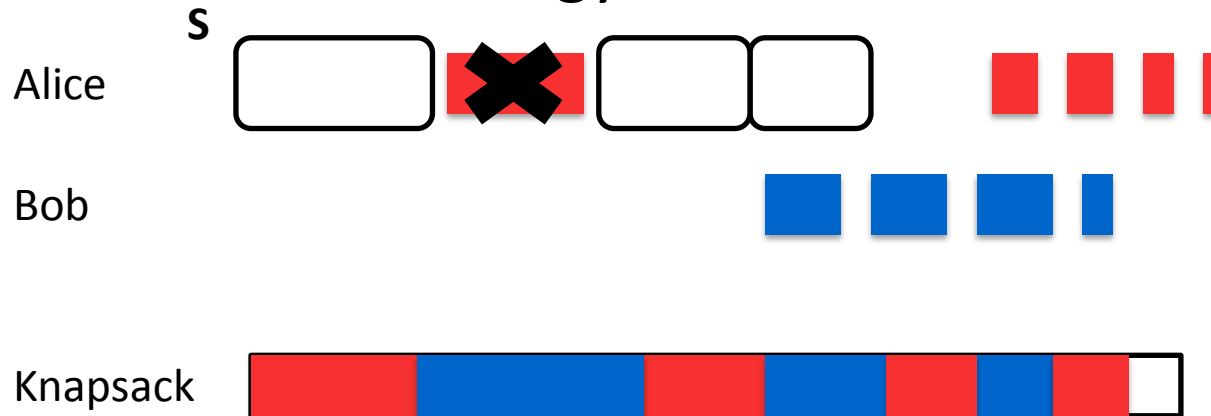
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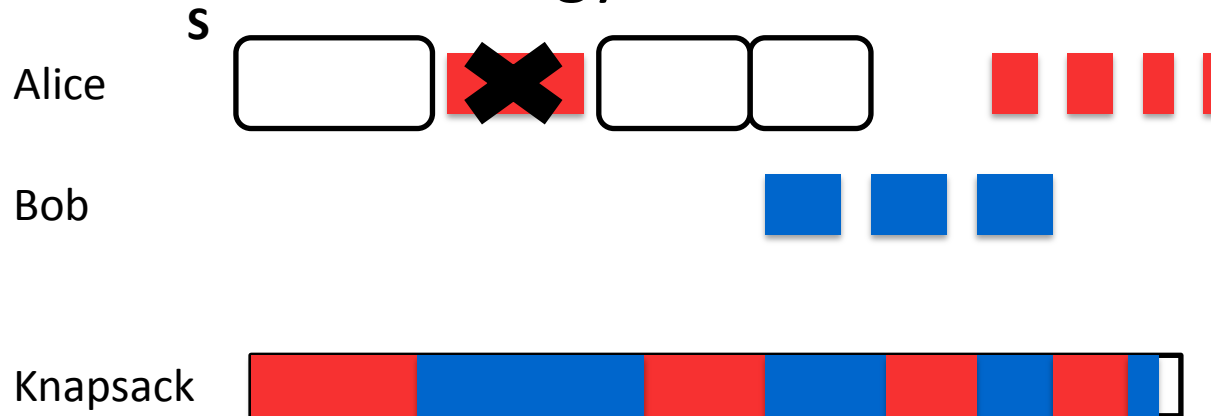
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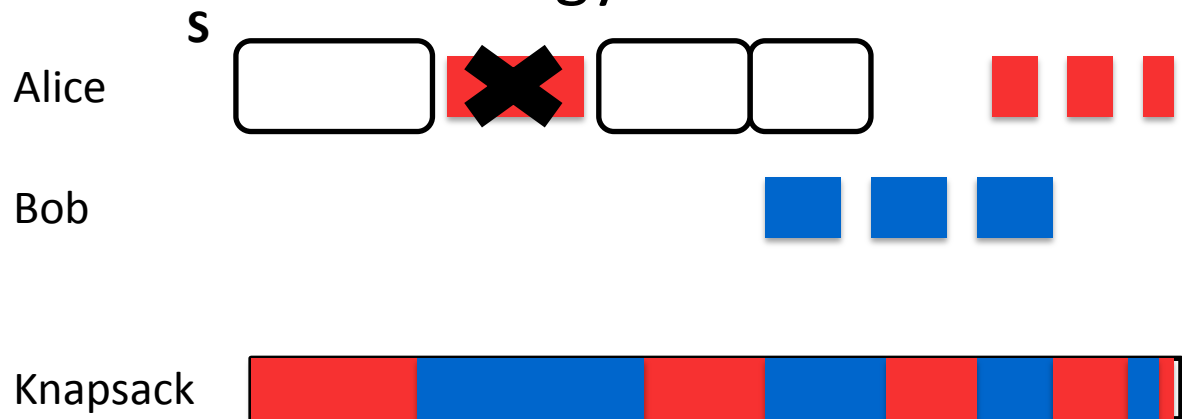
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Approximation factor

S^* : optimal strategy

- Non-increasing order

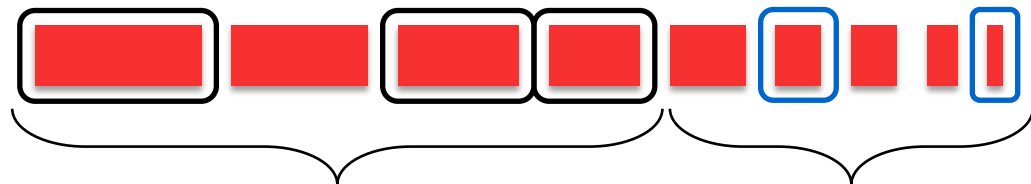
S^* , weight α^*



S' :

- First $1/\varepsilon$ items of S^*
- Continue greedily

S' , weight α'



First $1/\varepsilon$ items

Remaining items

PTAS considered S'

- Finds a strategy of weight at least α'

Show $\alpha' \geq (1 - \varepsilon) \cdot \alpha^*$

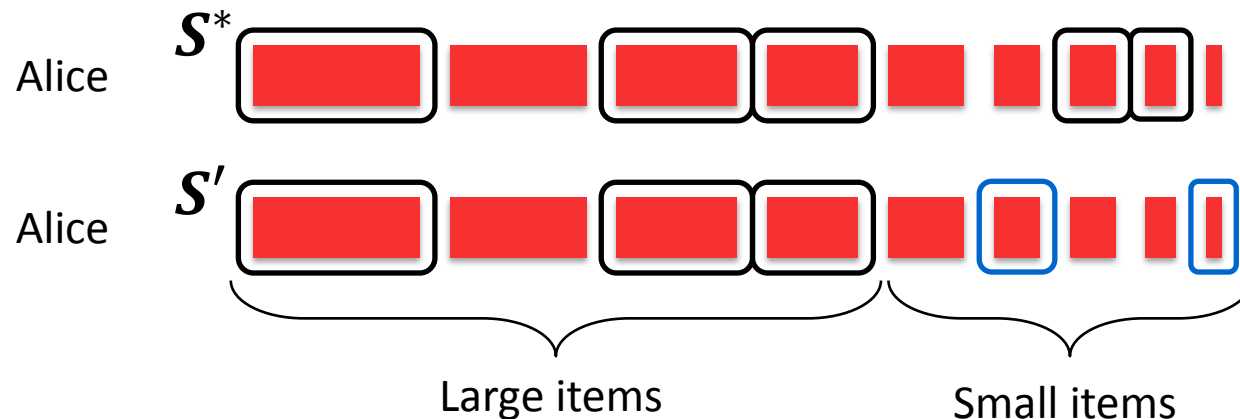
Approximation factor

Weight of the first $1/\varepsilon$ items

- Equal

Weight of the remaining items

- Remaining items are small: $a_i \leq \varepsilon \cdot \alpha^*$
 - Else, first $1/\varepsilon$ items have weight at least α^*



Approximation factor

Difference: mistake by greedy when packing small

Lemma

Difference between greedy and selfish strategy is bounded by the size of the largest item of Alice (when playing against greedy Bob)

- Size of largest item $\leq \varepsilon \alpha^*$
- Thus $\alpha' \geq (1 - \varepsilon)\alpha^*$

Running time

Try all size $1/\varepsilon$ subsets

- $O(n^{1/\varepsilon})$

Continue greedily

- $O(n^2)$

Polynomial in n for ε constant

Theorem

The subset sum game against a greedy adversary has a PTAS

Note: not an FPTAS

No FPTAS

PTAS with running time polynomial in

- n
- $1/\varepsilon$

Theorem

The subset sum game against a greedy adversary has no FPTAS, unless $P = NP$

FPTAS gives polynomial-time algorithm for PARTITION

Inapproximability against the
selfish player

Inapproximability

Theorem

A constant-factor approximation for the weight of Alice against selfish, implies $P = NP$.

Reduction from **Partition** (NP-hard)

- Input: Items $X = x_1, x_2, \dots, x_n$ with $\sum x_i = 2U$
- Question: Does there exist $S \subset X$ with sum U ?
 - Partition X into 2 sets with equal sum

Proof strategy

Given instance for Partition

- Construct an instance for the Subset Sum game
- If **yes-instance** for Partition
 - Alice can pack **at most n**
- If **no-instance** for Partition
 - Alice can pack **more than n/α**
- Run α -approximation algorithm for Subset Sum game
 - Weight less than n , return **yes**
 - Weight more than n , return **no**

Reduction

Given x_1, \dots, x_n for partition, with sum $2U$

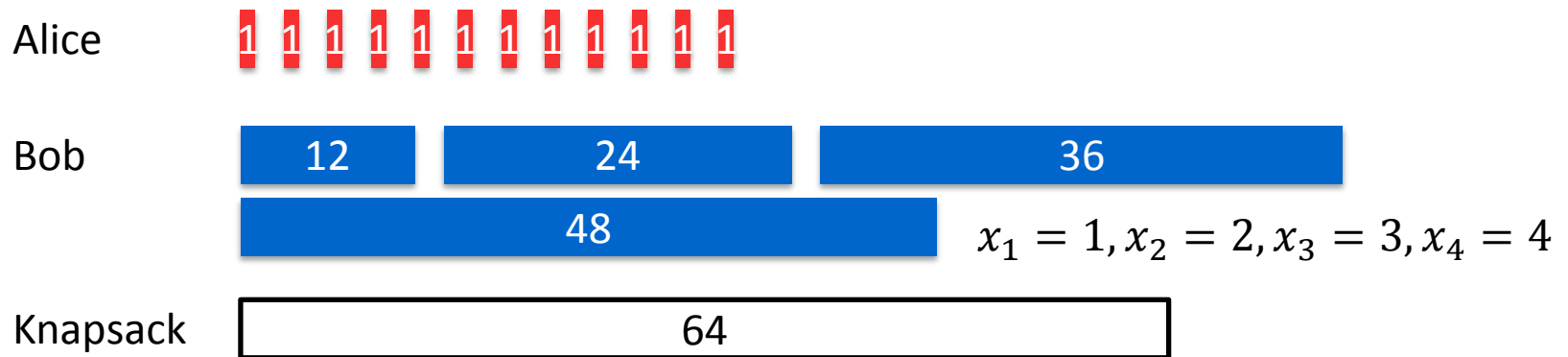
Give to Alice

- M items of weight 1

Give to Bob

- An item of weight $M * x_i$ for each $i \in [n]$

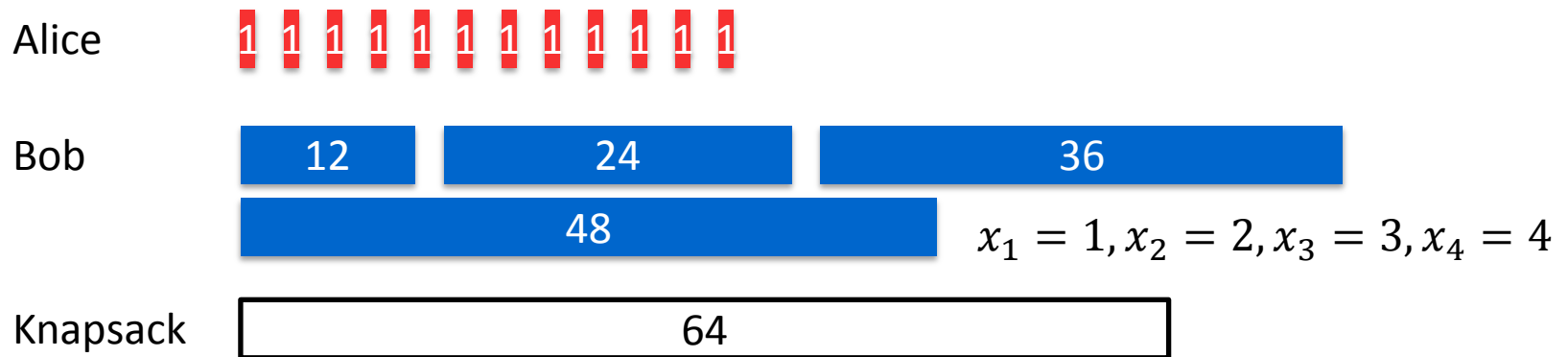
Let the capacity be $c = M * U + n$



$$R = 3, n = 4, U = 5$$

Reduction

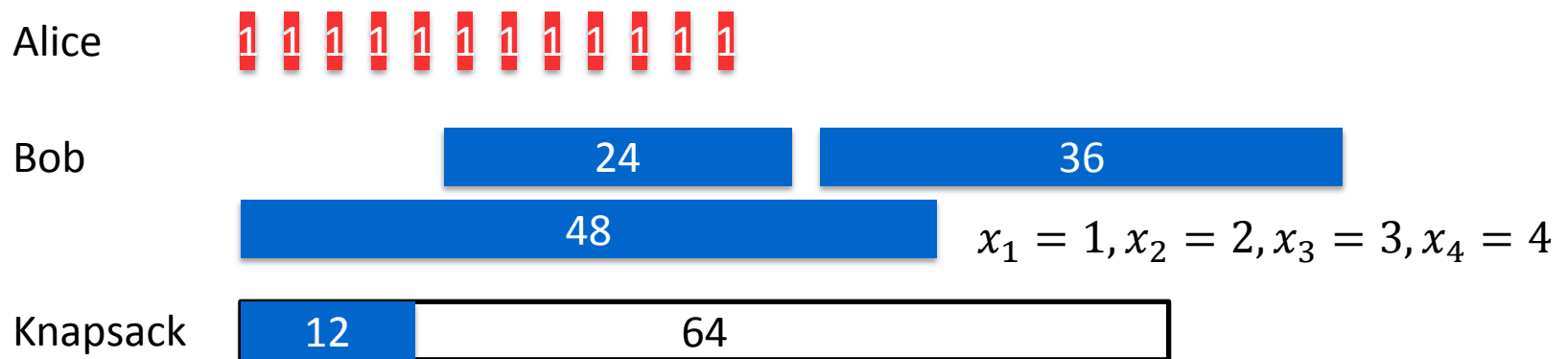
- Partition was a **yes**-instance
 - Bob packs $M \cdot U = c - n$
 - Alice can only pack weight n



$$R = 3, n = 4, U = 5$$

Reduction

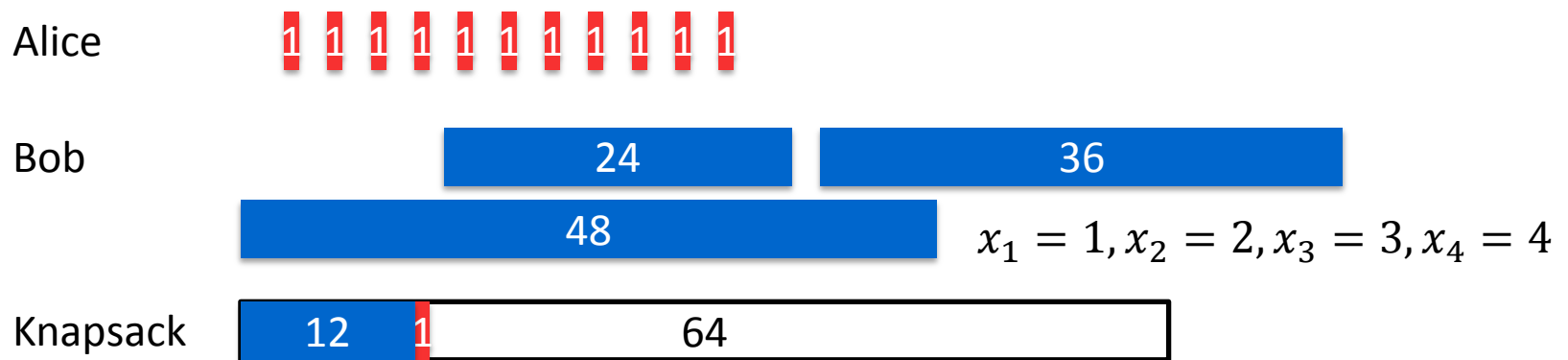
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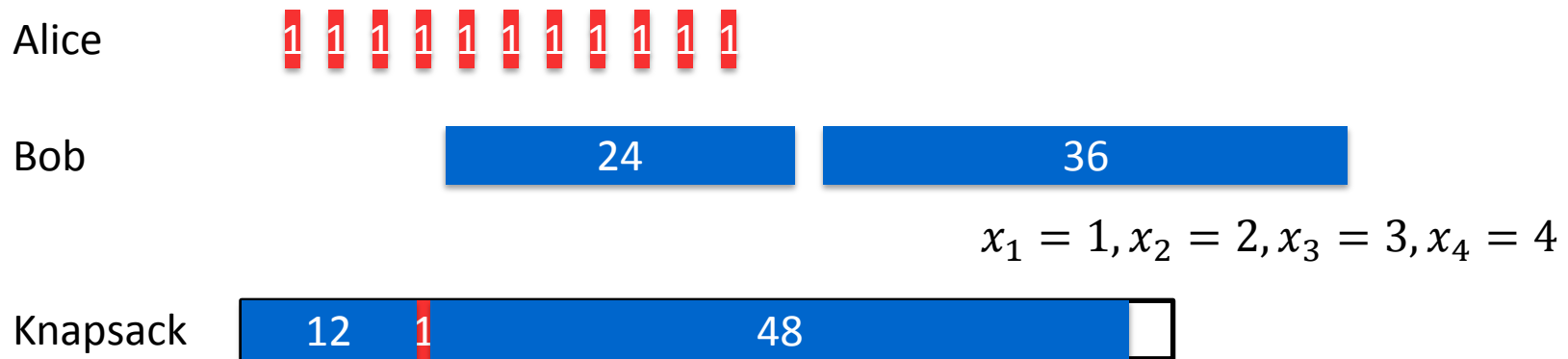
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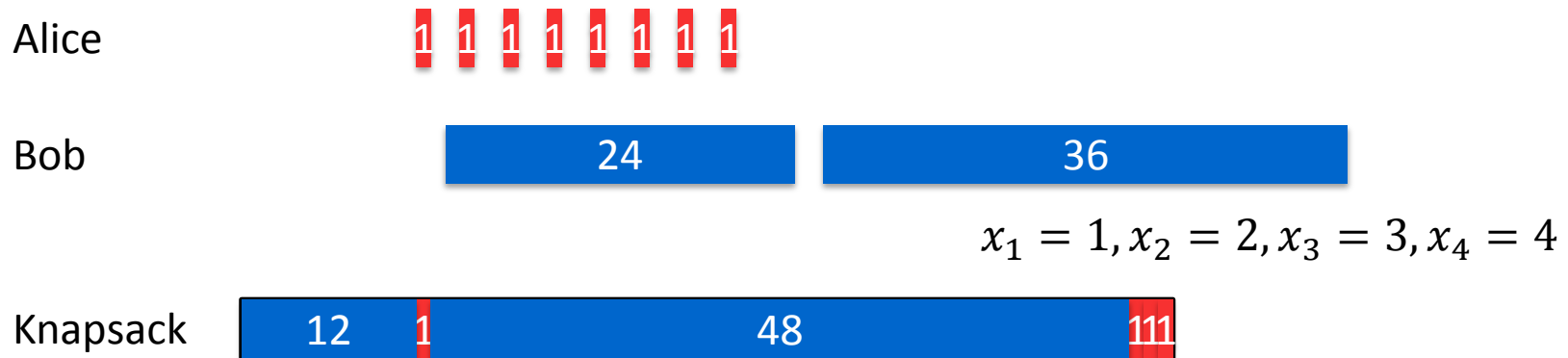
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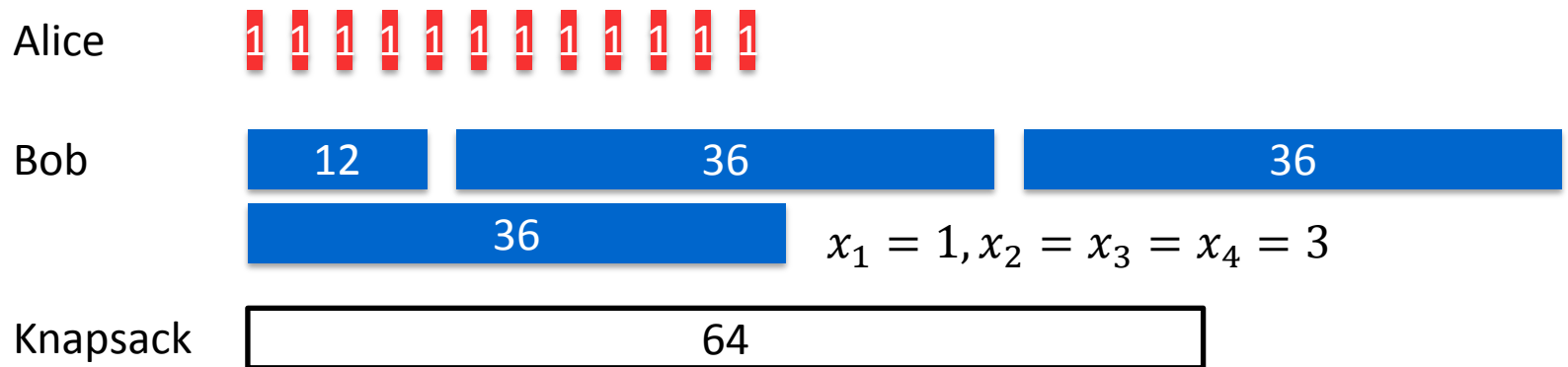
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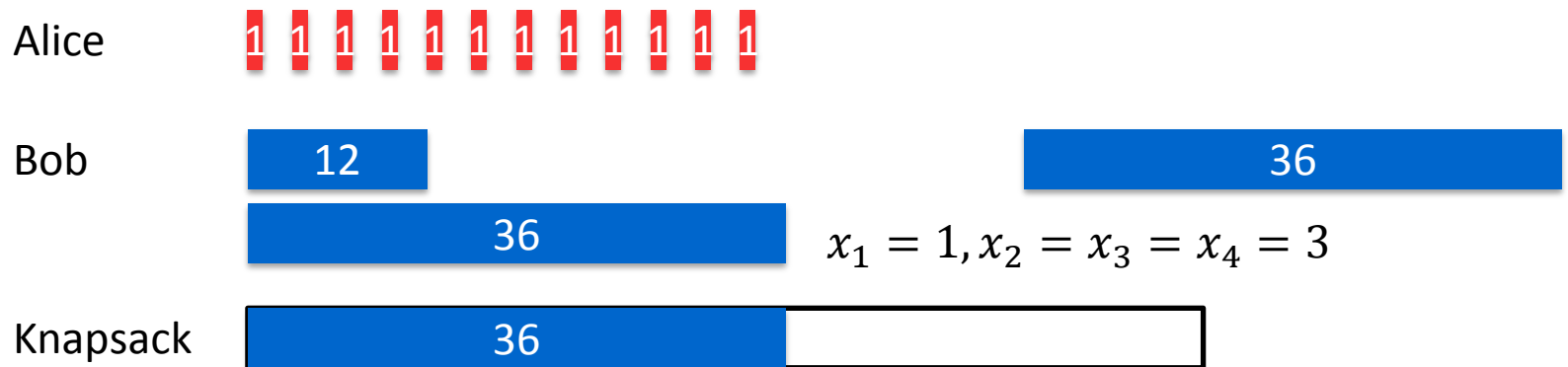
- Partition was a **yes**-instance
 - Bob packs $M \cdot U = c - n$
 - Alice can only pack weight n
- Partition was a **no**-instance
 - Bob can pack at most $M(U - 1)$
 - Alice can place at least weight M



$$R = 3, n = 4, U = 5$$

Reduction

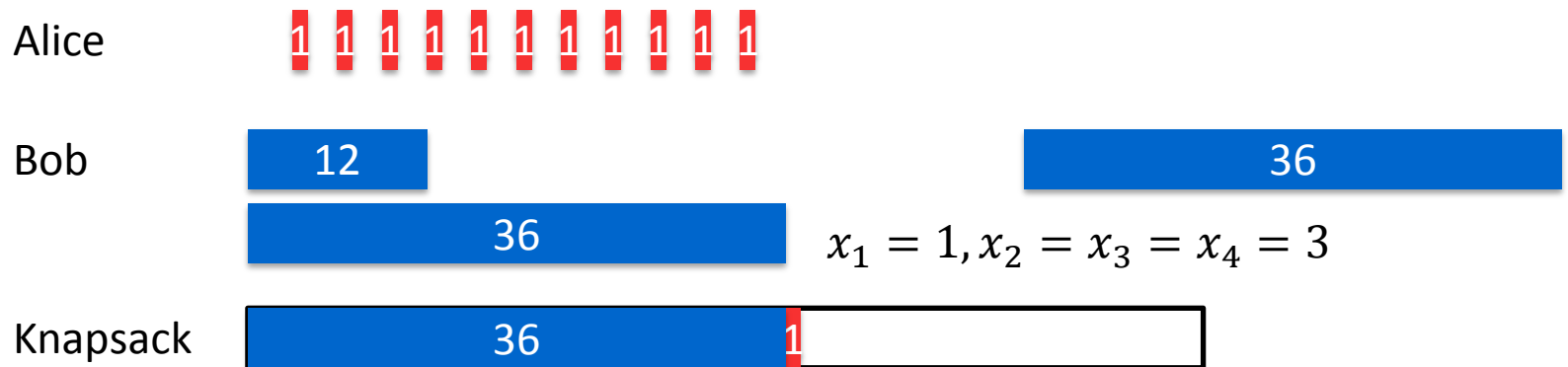
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$$R = 3, n = 4, U = 5$$

Reduction

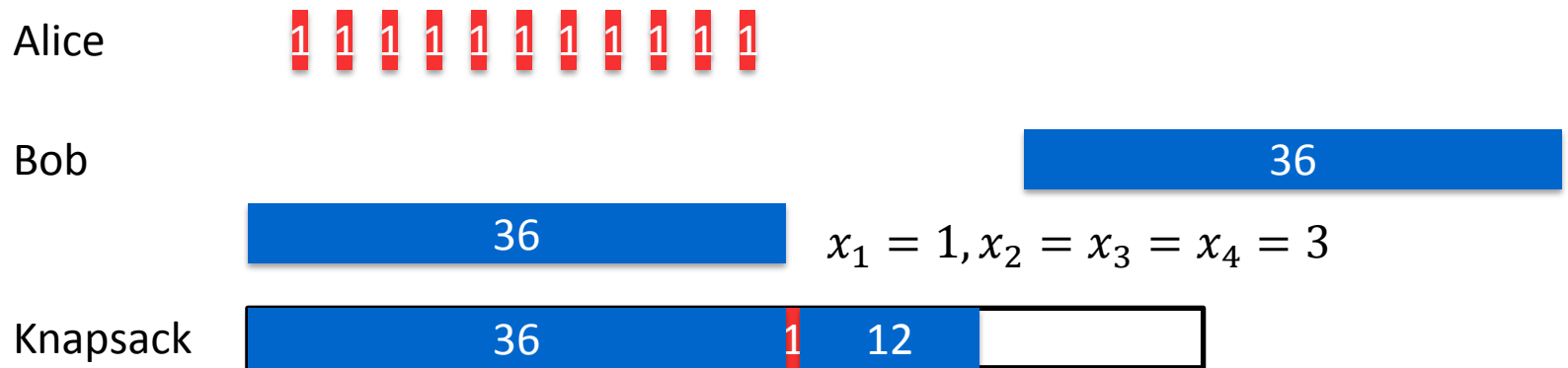
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$$R = 3, n = 4, U = 5$$

Reduction

- Partition was a **yes**-instance
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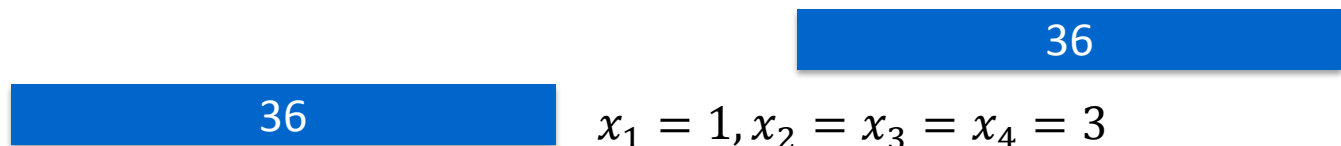
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Alice

Bob



Knapsack



$$R = 3, n = 4, U = 5$$

Reduction

α -approximation for Subset Sum game



polynomial-time algorithm for Partition

Theorem

A constant-factor approximation for the weight of Alice against selfish, implies $P = NP$.

The same holds against a hostile player

Pseudo-polynomial time algorithm

Algorithm against greedy

Theorem

The game against greedy is solvable in time $O(n^2 m^2 c^4)$

Use dynamic programming

$[i, j, W_A, W_B] :=$ Maximum weight Alice can obtain

- It is Alice's turn
- Weight of Alice is W_A , weight of Bob W_B
- Alice just packed i , Bob j

Take state with best-reachable W_A

Reachability

Check whether a state is reachable from another

$[i, j, W_A, W_B]$ to $[i', j', W'_A, W'_B]$

- $i < i'$
- $j < j'$
- $W'_A = W_A + a_{i'}$
- $W'_B = W_B + b_{j'}$
- The items still fit
- $b_{j'}$ was the largest available Bob-item
 - Thus the Greedy choice

Conclusion

SSG against hostile/selfish

- *PSPACE* complete
- No α -approximation unless $P = NP$

SSG against greedy

- Solvable in pseudo polynomial time
- Has a PTAS
- Has no FPTAS unless $P = NP$