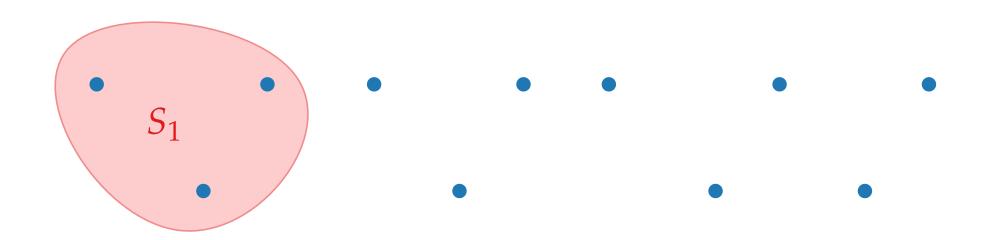
Approximation Algorithms

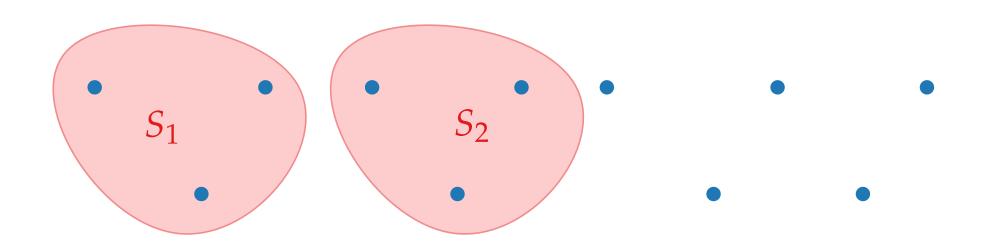
Lecture 2: SetCover and ShortestSuperString

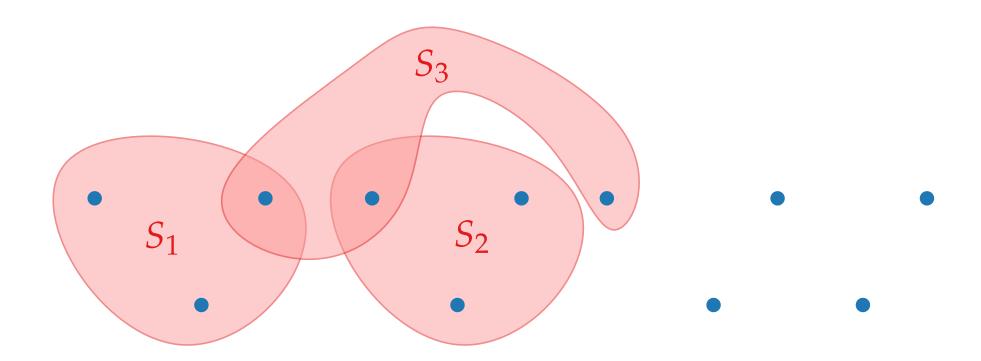
Part I: SetCover

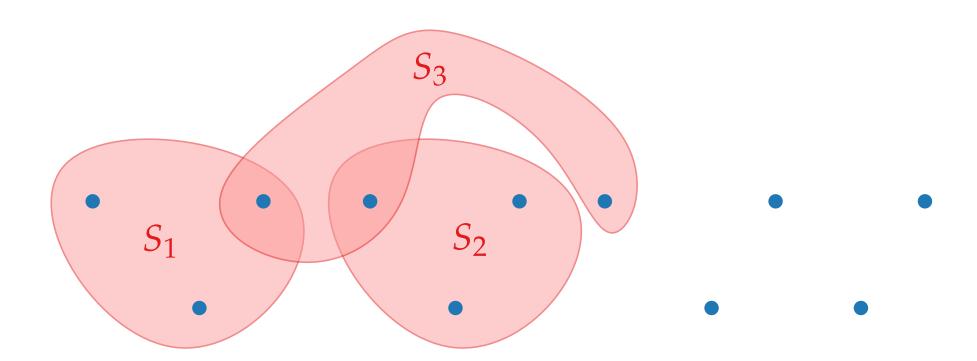
Given a ground set *U*

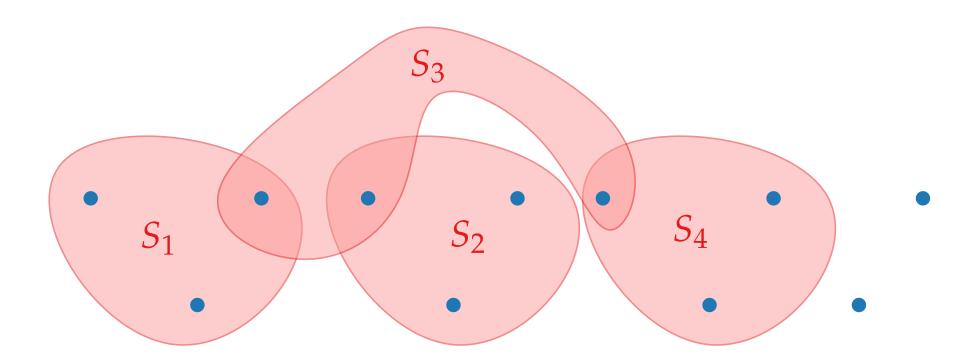
Given a ground set *U*

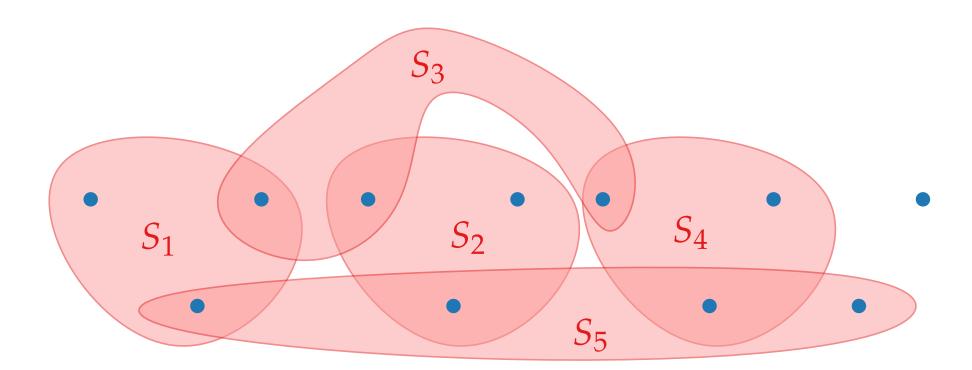


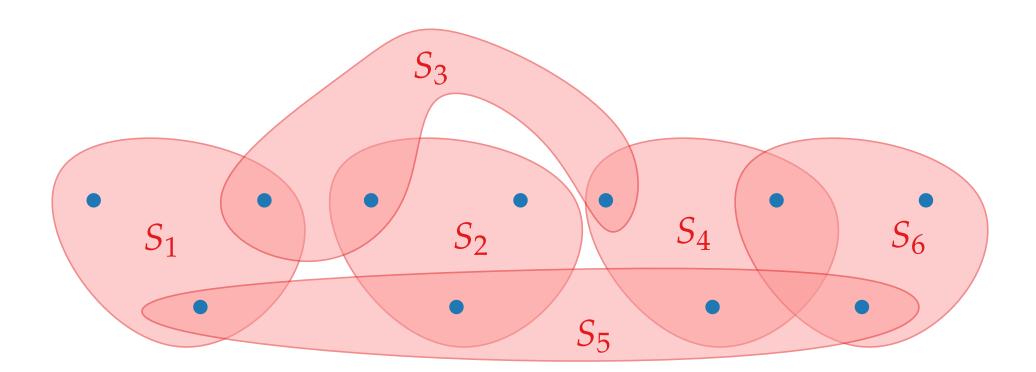




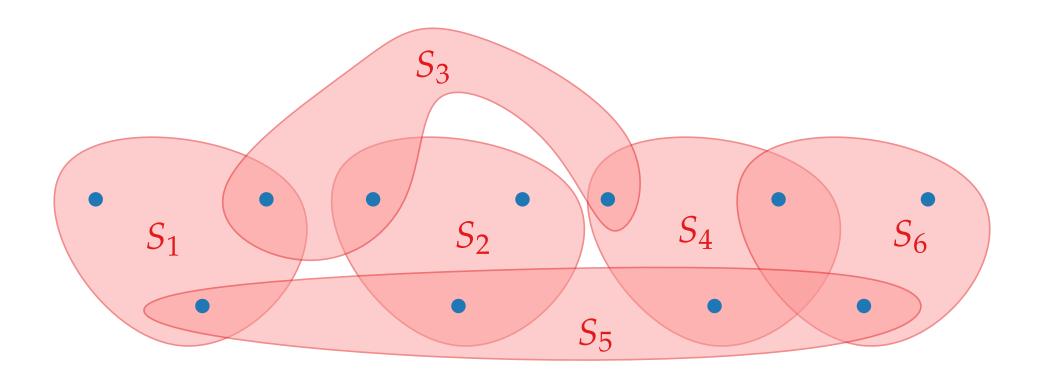




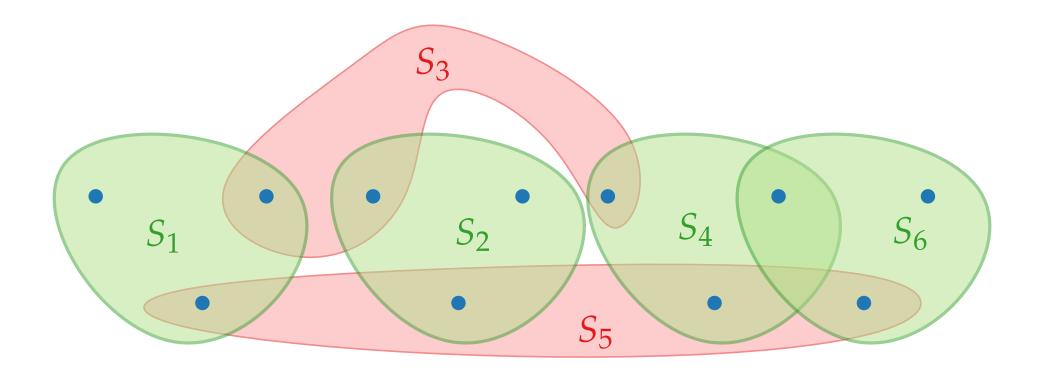




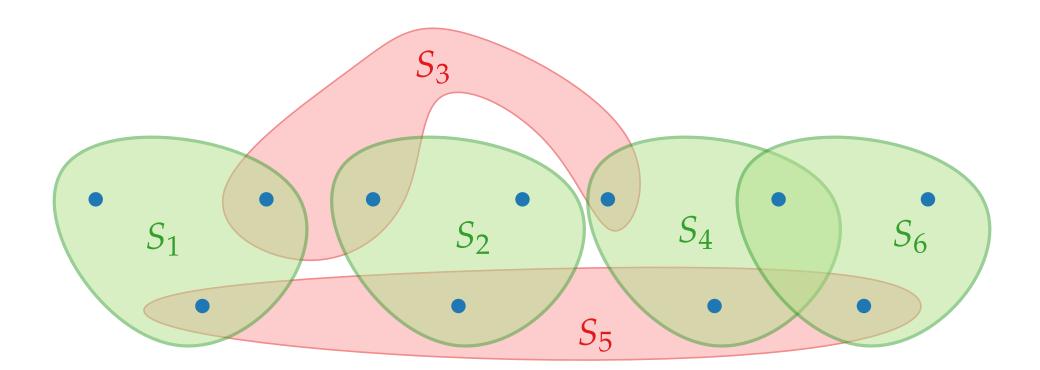
Given a **ground set** U and a family S of **subsets** of U with $\bigcup S = U$.



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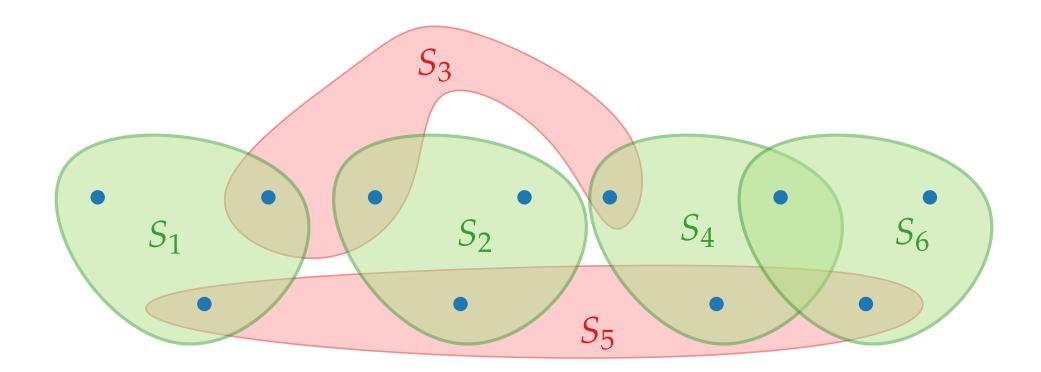


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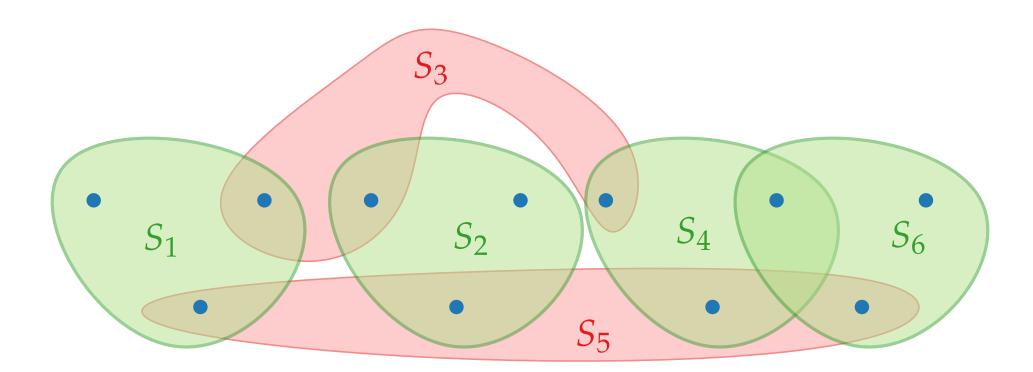
Each $S \in \mathcal{S}$ has $\cos c(S) > 0$.



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Each $S \in \mathcal{S}$ has cost c(S) > 0.

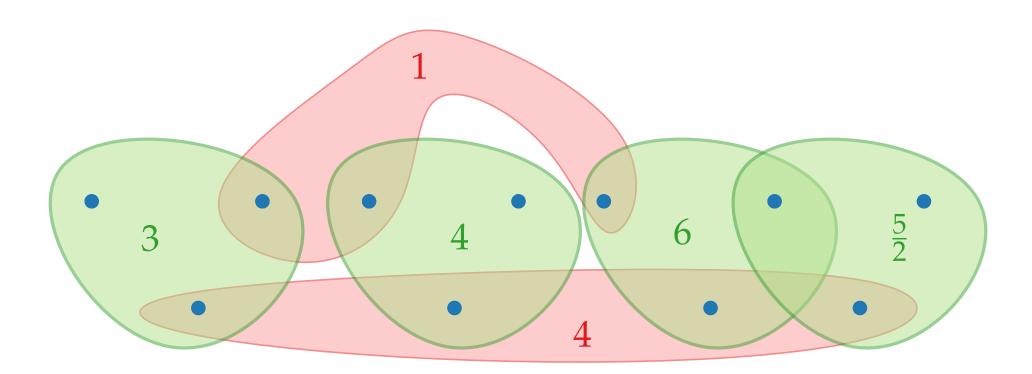
Find a cover $S' \subseteq S$ of U (i.e. with $\bigcup S' = U$) of minimal cardinality. total cost $c(S') := \sum_{S \in S'} c(S)$.



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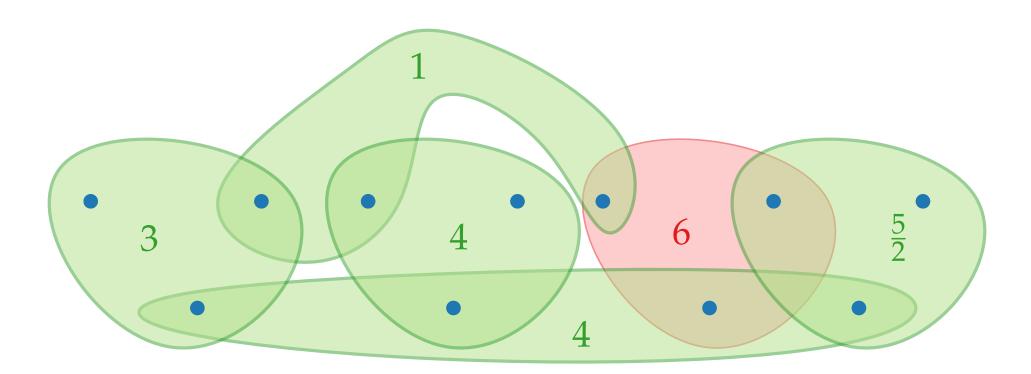
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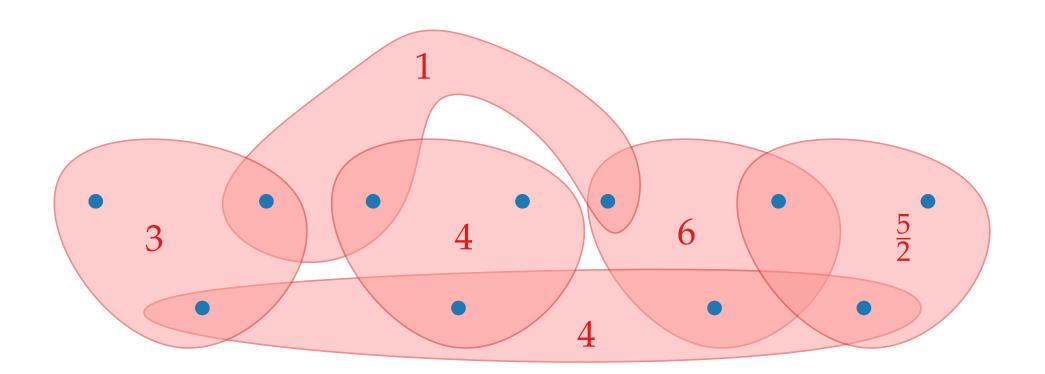


Approximation Algorithms

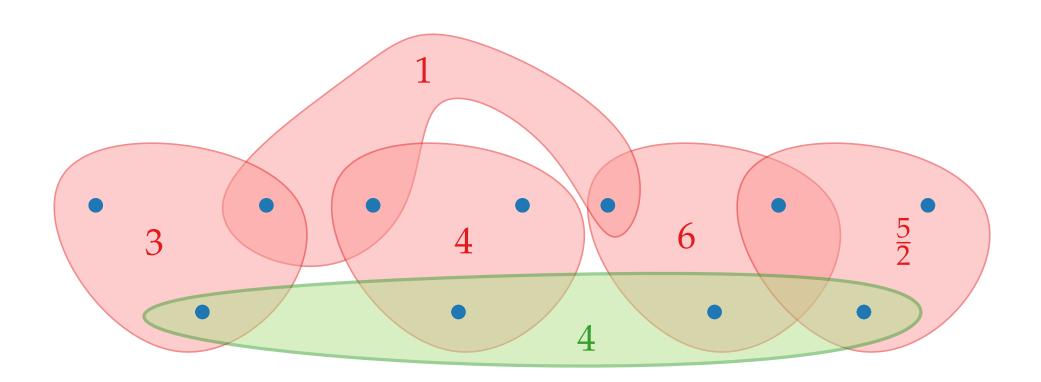
Lecture 2: SetCover and ShortestSuperString

Part II:
Greedy for SetCover

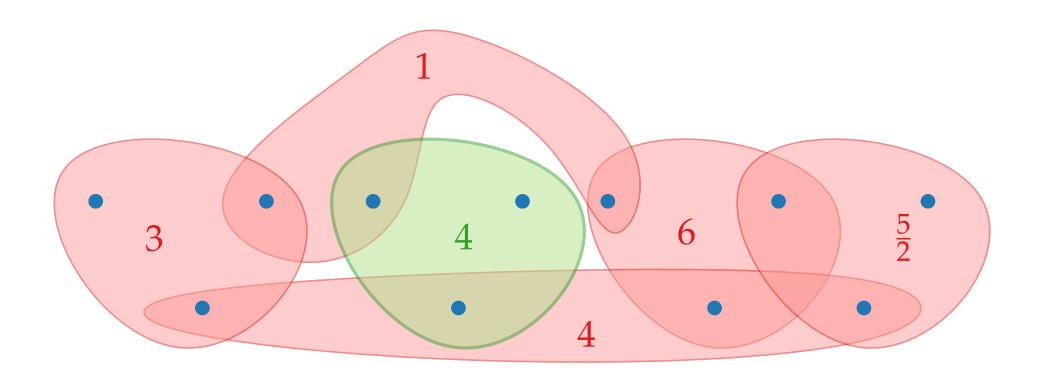
What is the real cost of picking a set?

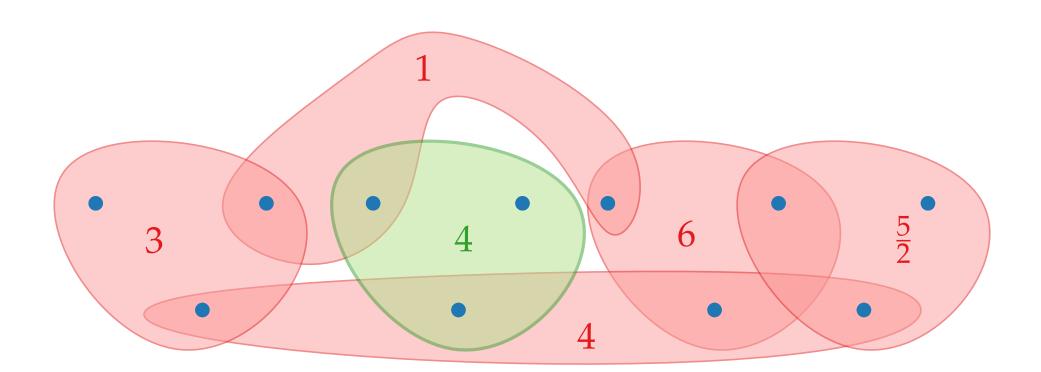


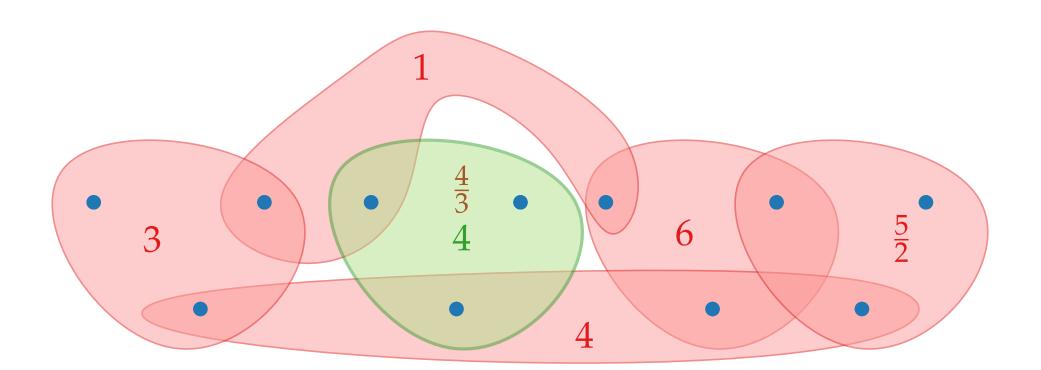
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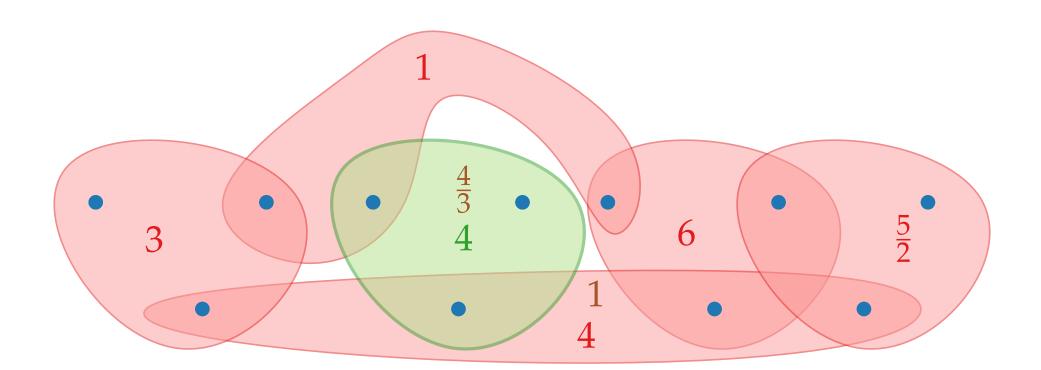


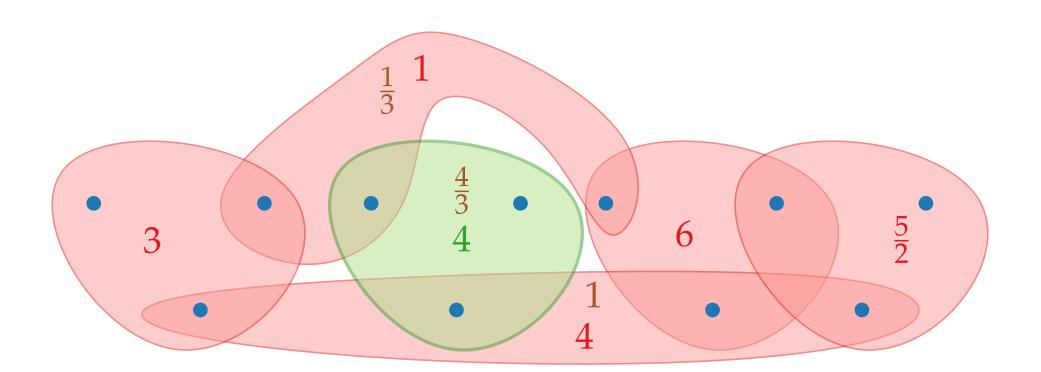
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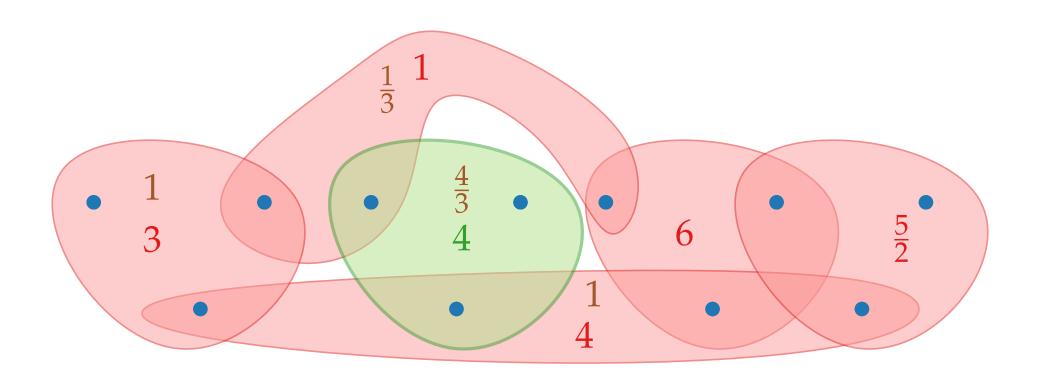


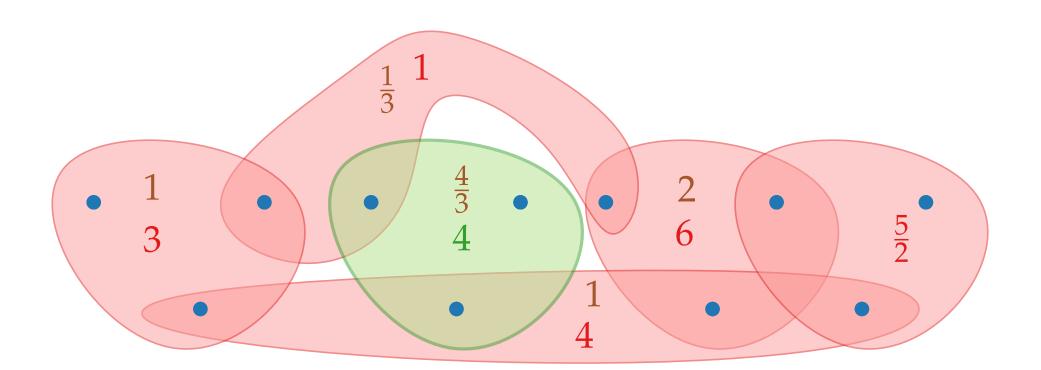


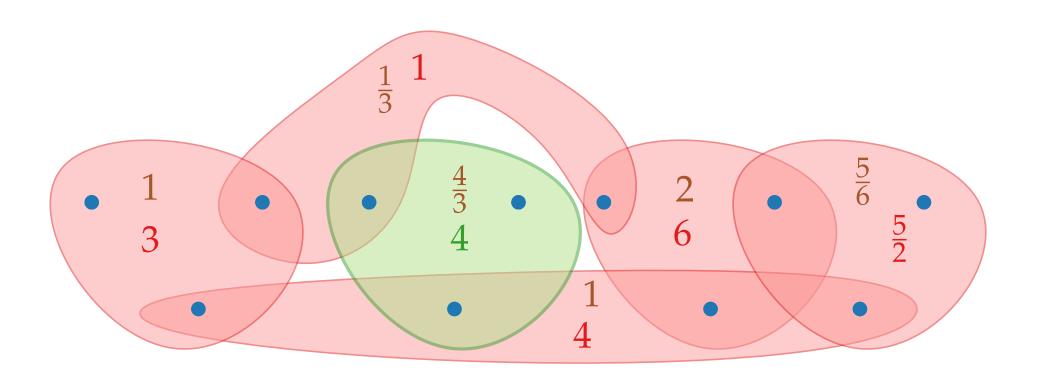




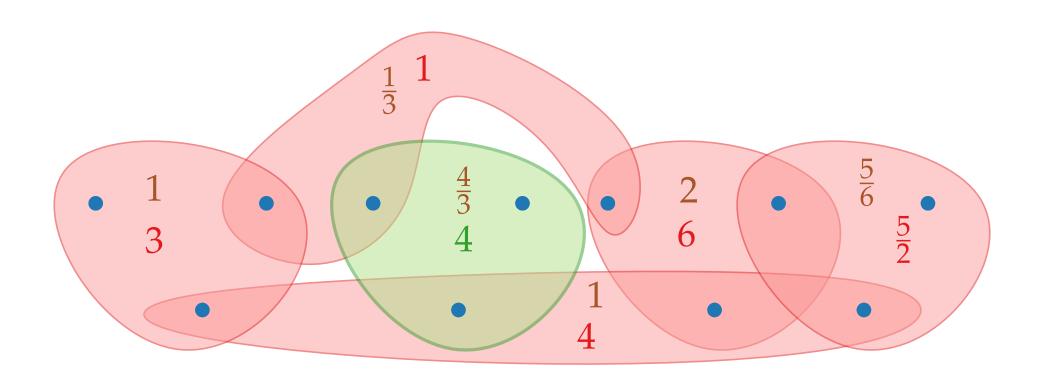


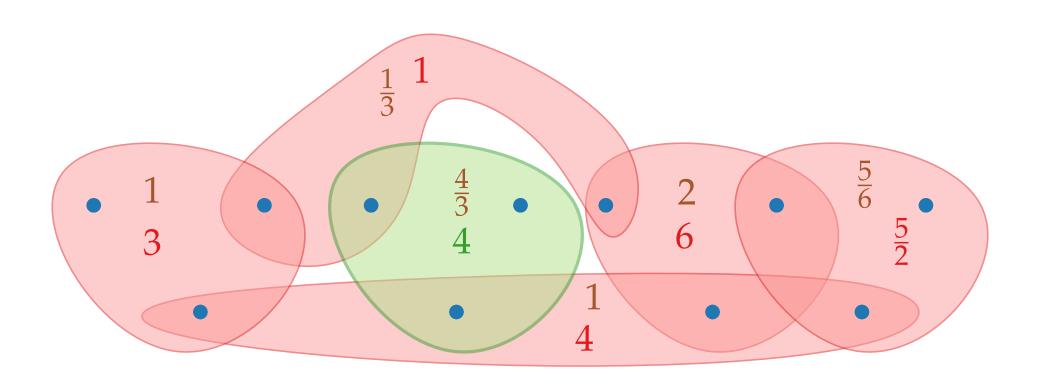


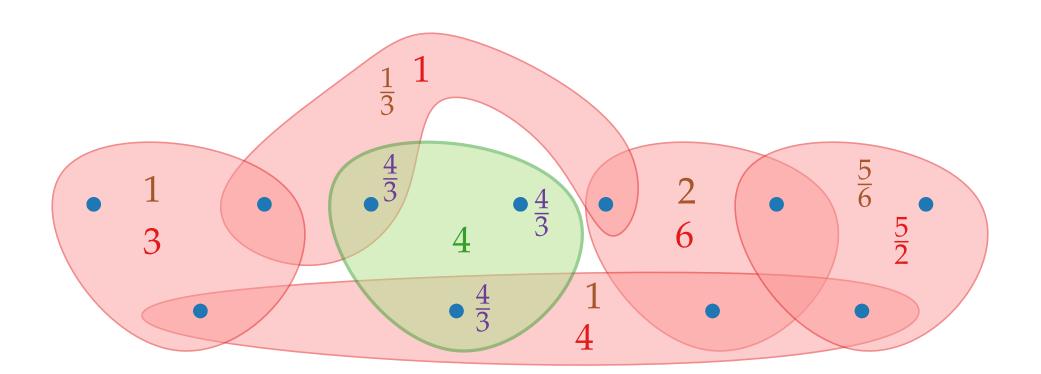


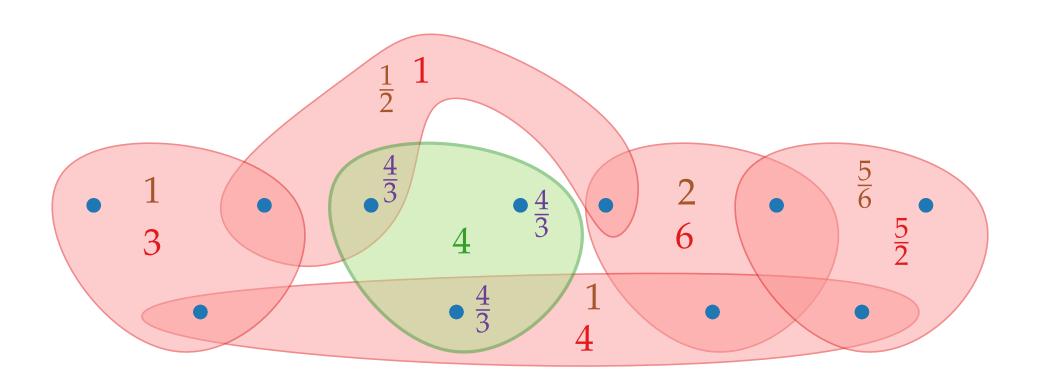


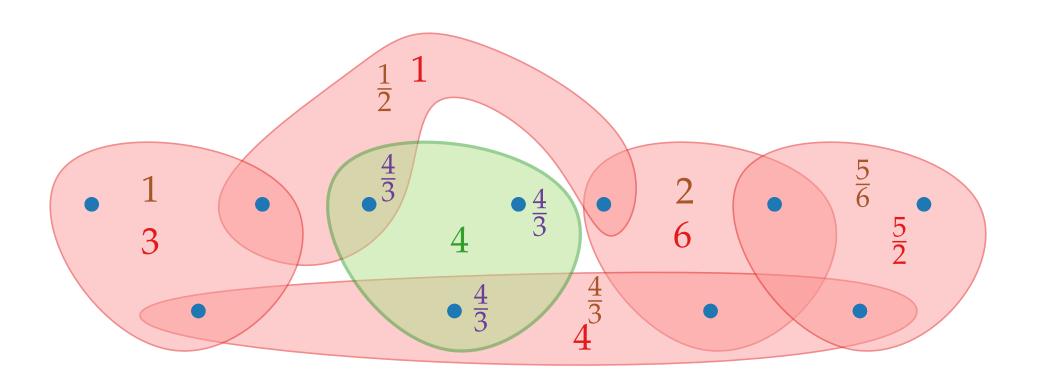
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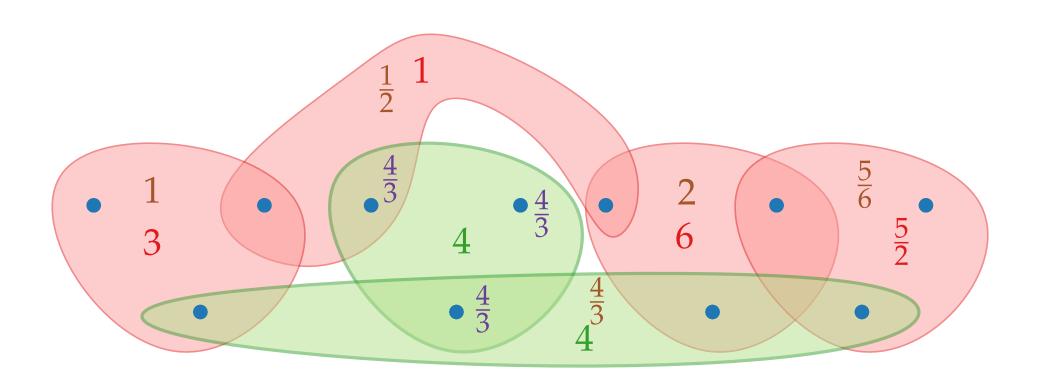


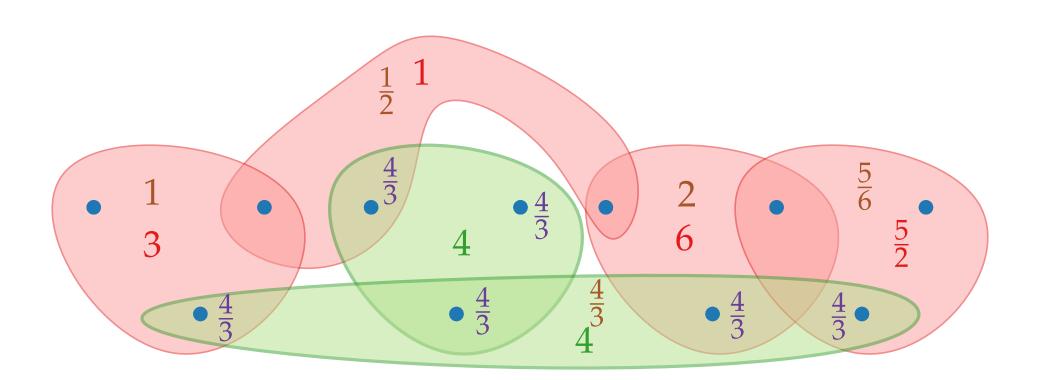


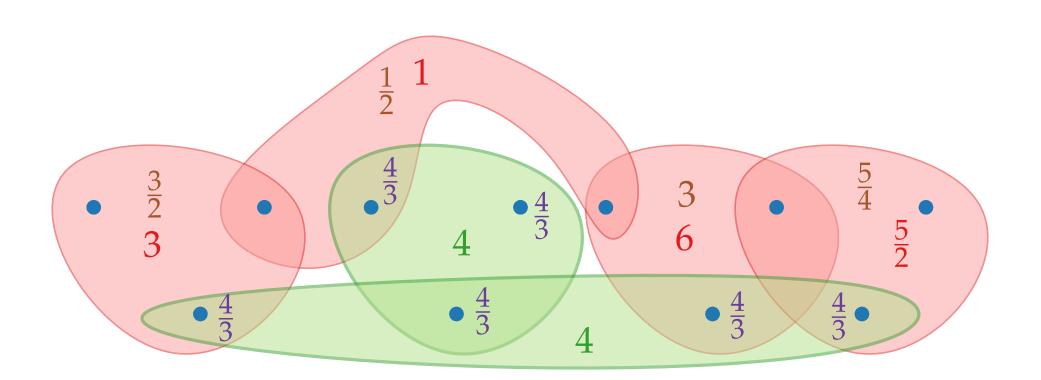


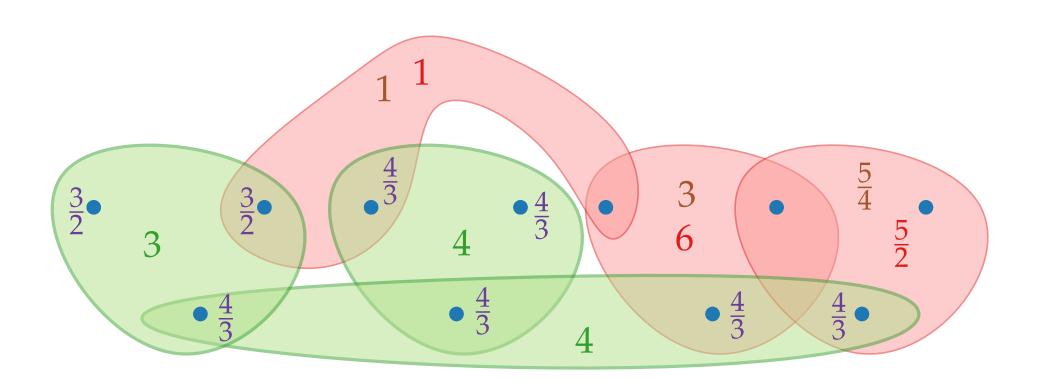


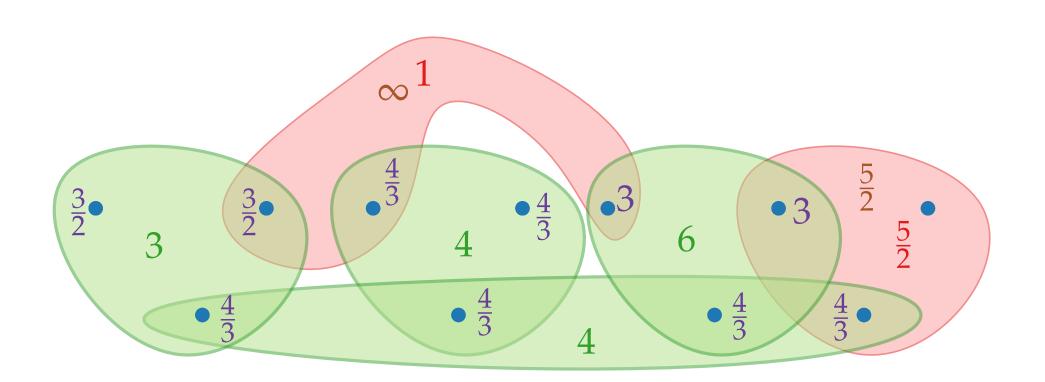


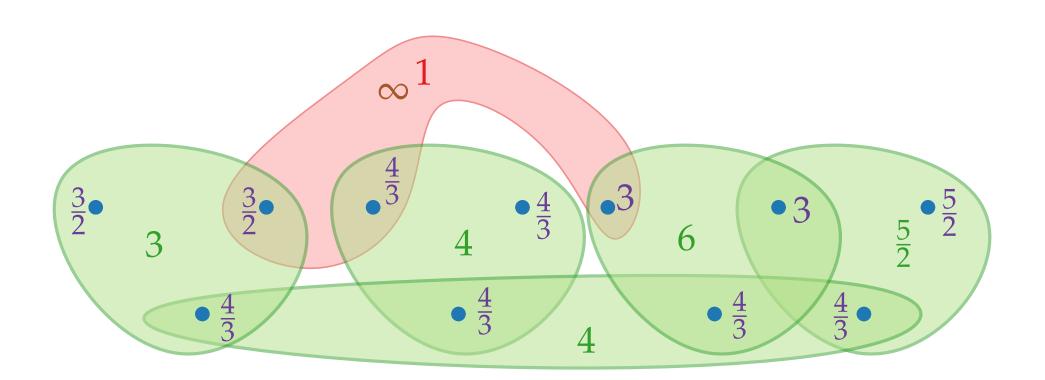




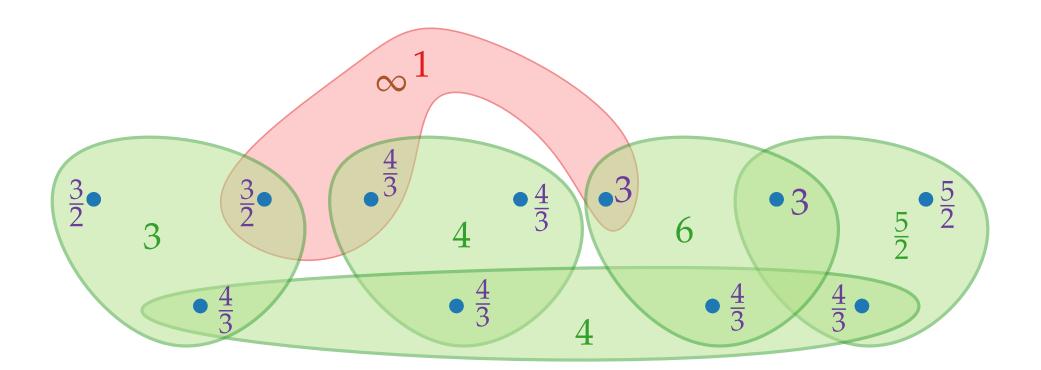








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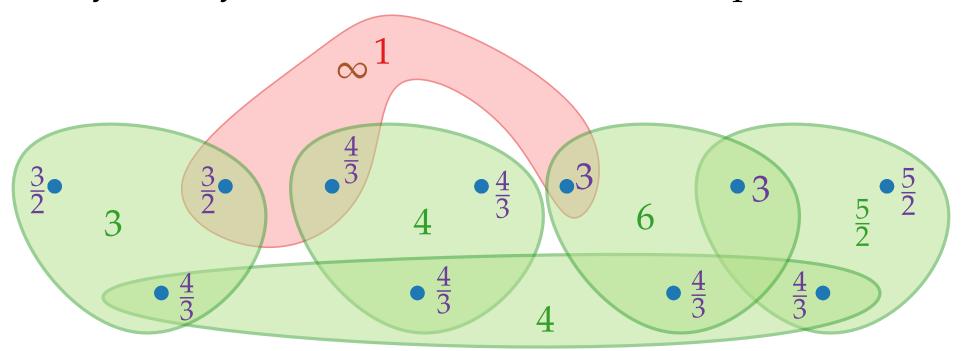
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What happens if we "buy" a set?

Fix price of elements bought and recompute unit cost.

total cost: $\sum_{u \in U} \operatorname{price}(u)$

Greedy: Always choose the set with the cheapest unit cost.



GreedySetCover(*U*, *S*, *c*) $C \leftarrow \emptyset$ $\mathcal{S}' \leftarrow \emptyset$ return S'// Cover of U

```
GreedySetCover(U, S, c)
  C \leftarrow \emptyset
  \mathcal{S}' \leftarrow \emptyset
  while C \neq U do
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                                                          // Cover of U
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         C \leftarrow C \cup S
         S' \leftarrow S' \cup \{S\}
   return \mathcal{S}'
                                                                        // Cover of U
```

Approximation Algorithms

Lecture 2:

SetCover and ShortestSuperString

Part III: Analysis

Theorem. GreedySetCover is a factor- H_k -approximation algorithm for SetCover, where k is the cardinality of the largest set in S and

$$H_k := 1 + \frac{1}{2} + \frac{1}{3} + \ldots + \frac{1}{k} = O(\log k).$$

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Proof. Alg. buys $u_j \Rightarrow$

= j - 1 elements of *S* already bought

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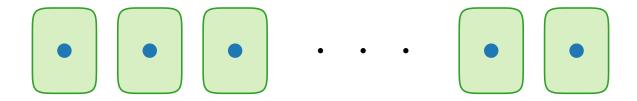
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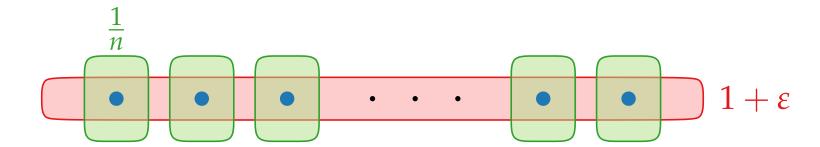


Analysis sharp?

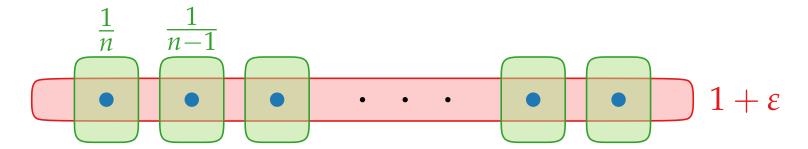
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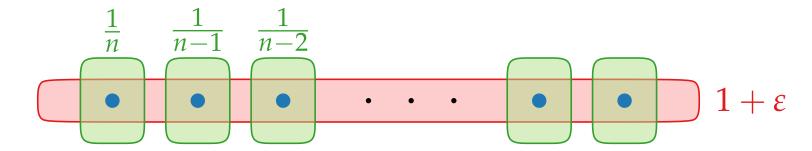
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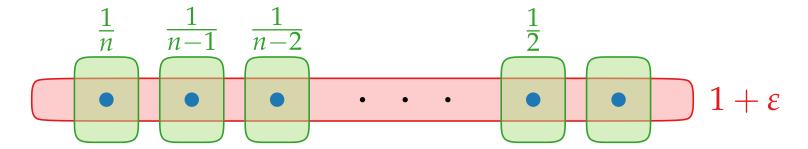
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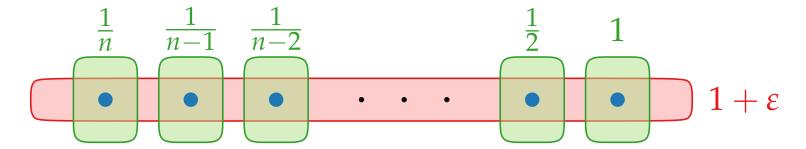
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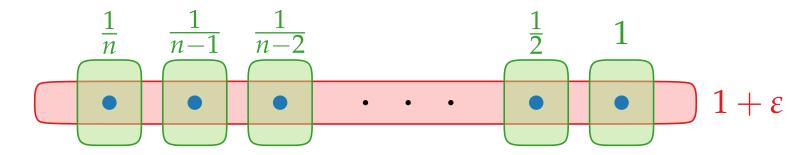
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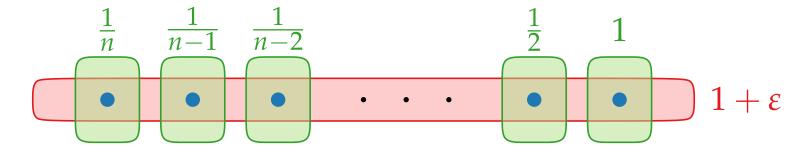


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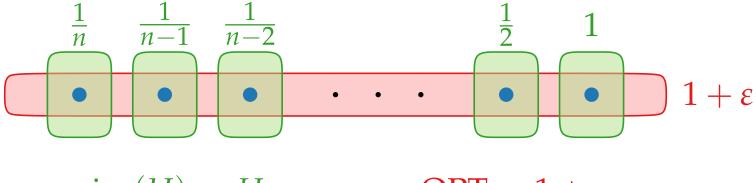
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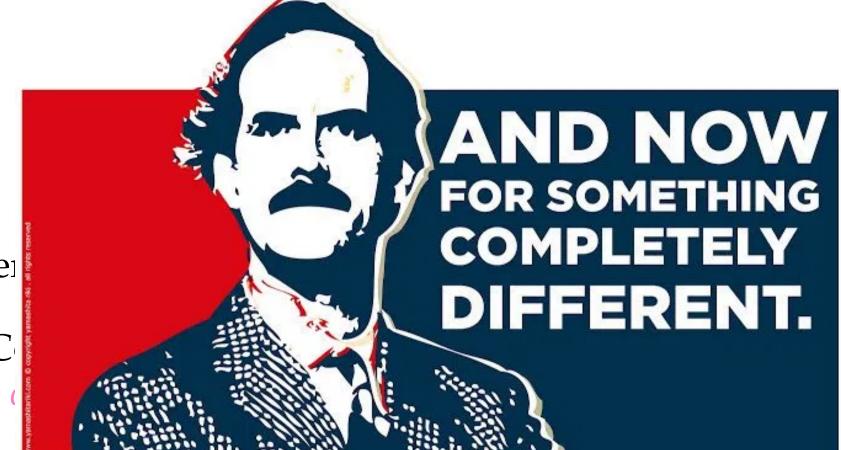
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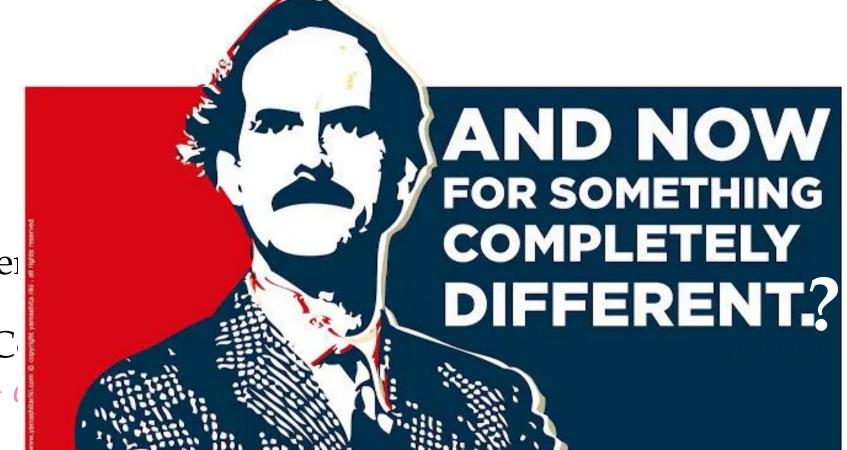


bette

SETC

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bette

SETC

Approximation Algorithms

Lecture 2: SetCover and ShortestSuperString

Part IV:
SHORTESTSUPERSTRING

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Example.

 $U := \{cbaa, abc, bcb\}$ cbaabcb

"covers" all strings in *U*

W.l.o.g.: No string s_i is a substring of any other string s_j .

abcbaa abc bcb cbaa

Set Cover Instance: ground set U, set family S, costs c.

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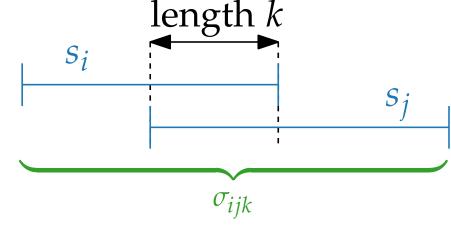


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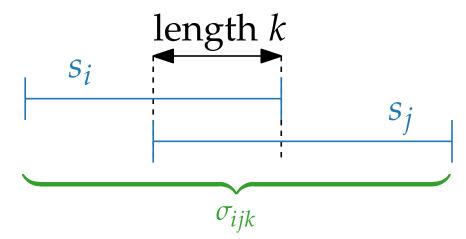
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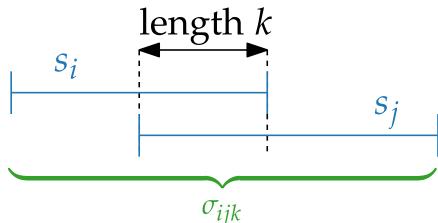
 s_i : cabab s_i : ababc



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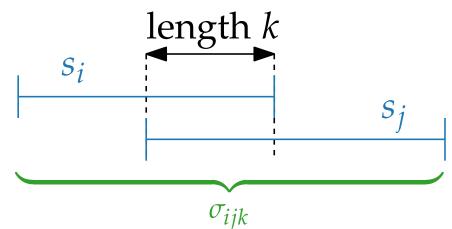
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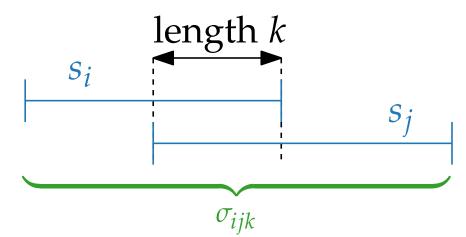
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```

 σ_{ijk}

 S_i

length *k*

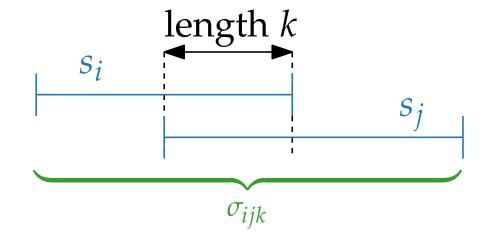
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SSS as a SetCover Problem

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 $S = \{S(\sigma_{ijk}) \mid k > 0\}$ (possibly $i = j$)

Approximation Algorithms

Lecture 2:

SetCover and ShortestSuperString

Part V:

Solving ShortestSuperString via SetCover

Philipp Kindermann

Summer Semester 2020

Lemma. Let OPT_{SSS} be the length of a shortest superstring of U and OPT_{SC} be the minimum cost of the corresponding SetCover instance. Then:

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Consider an optimal set cover $\{S(\pi_1), \ldots, S(\pi_k)\}$ of U.

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Thus, $OPT_{SSS} \leq |s| = OPT_{SC}$.

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leftmost occurence of a string $s_{b_1} \in U$.

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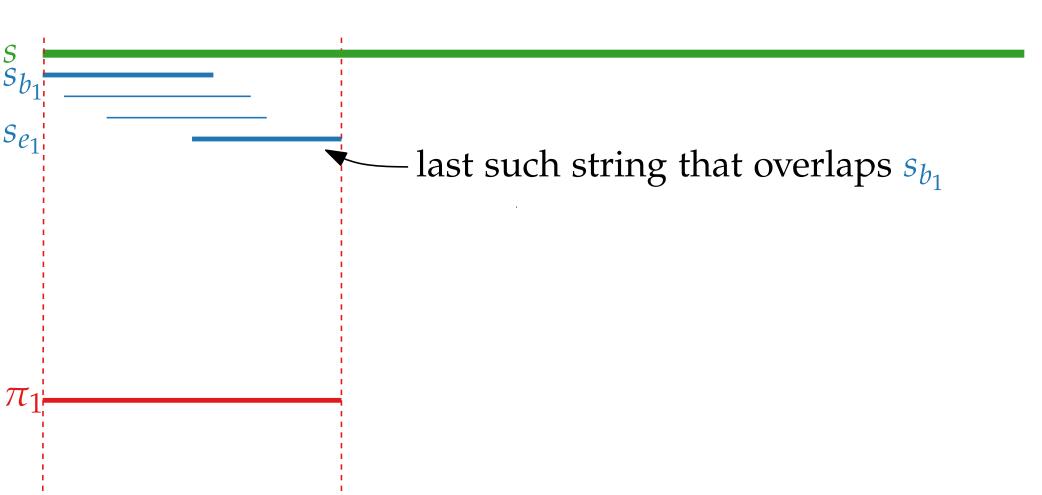


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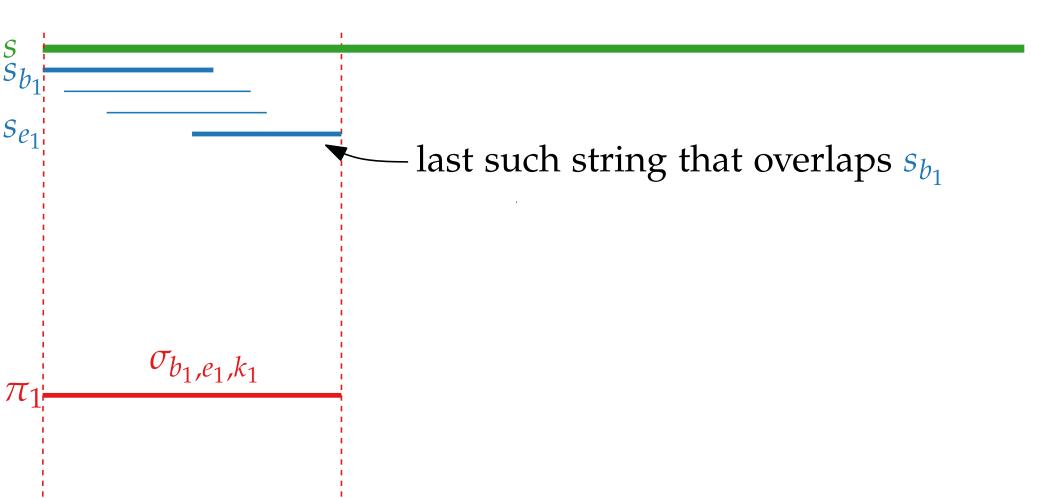


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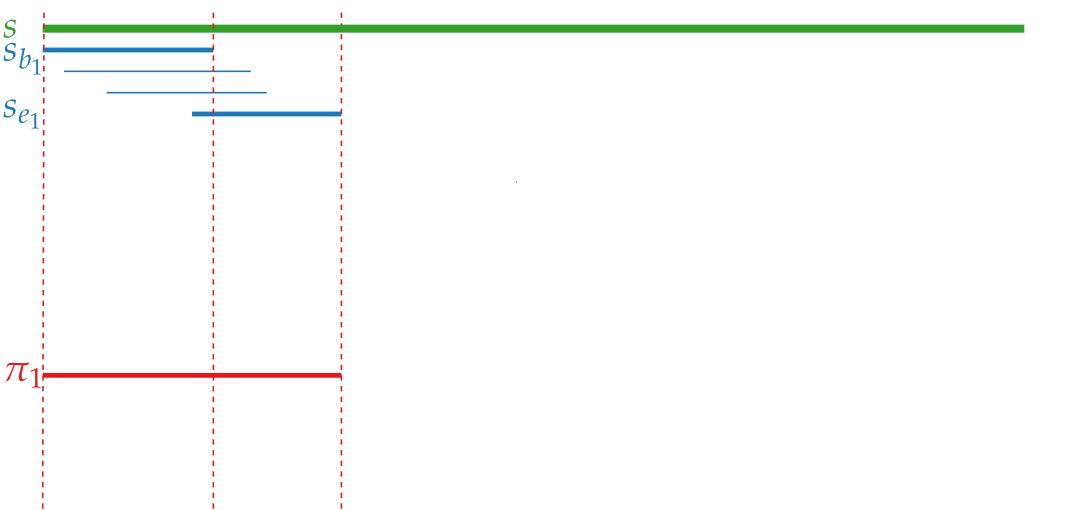


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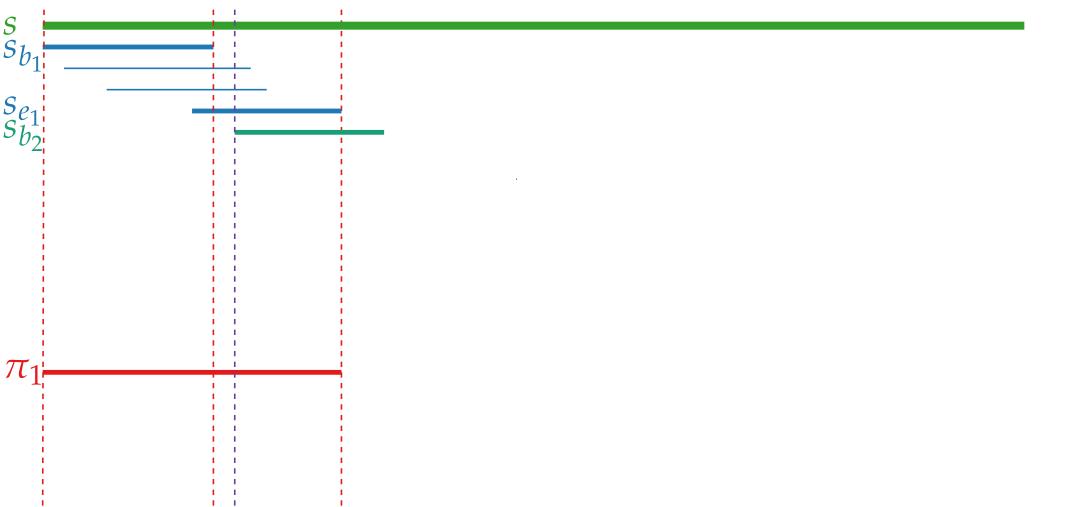


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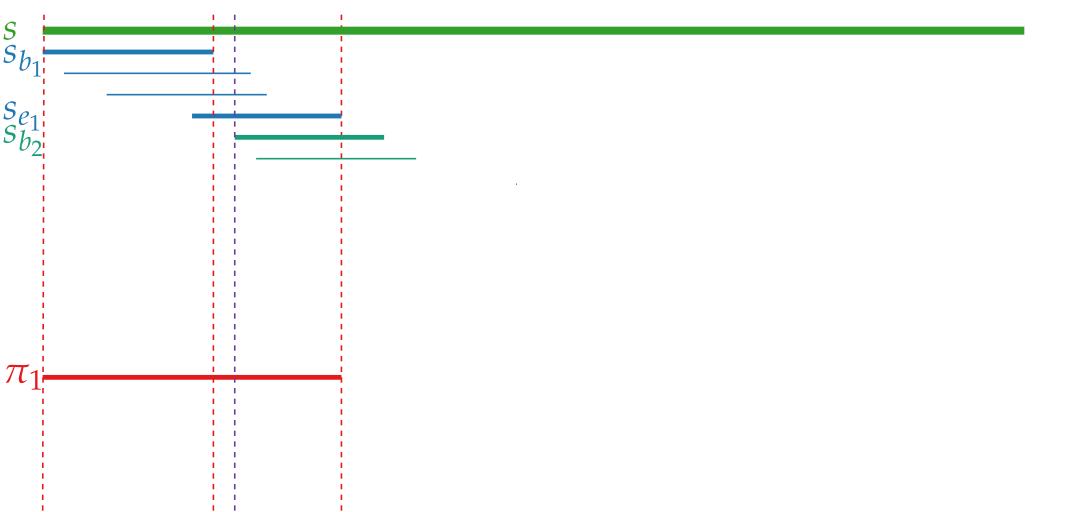


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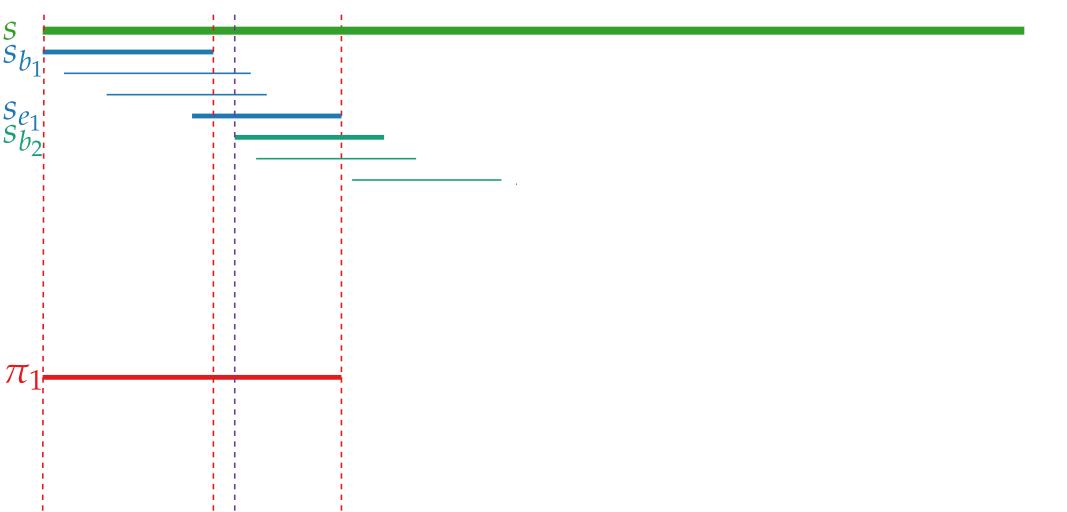


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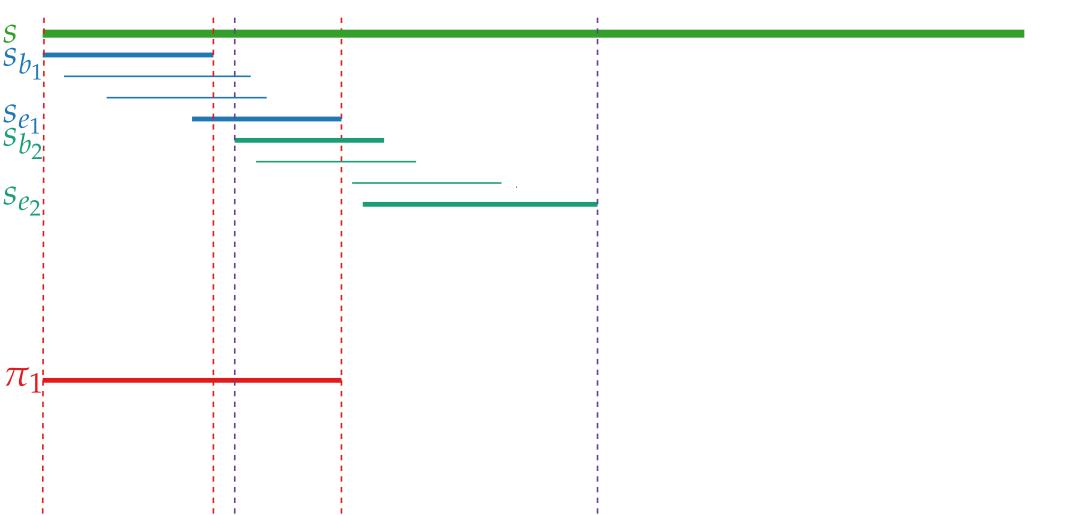


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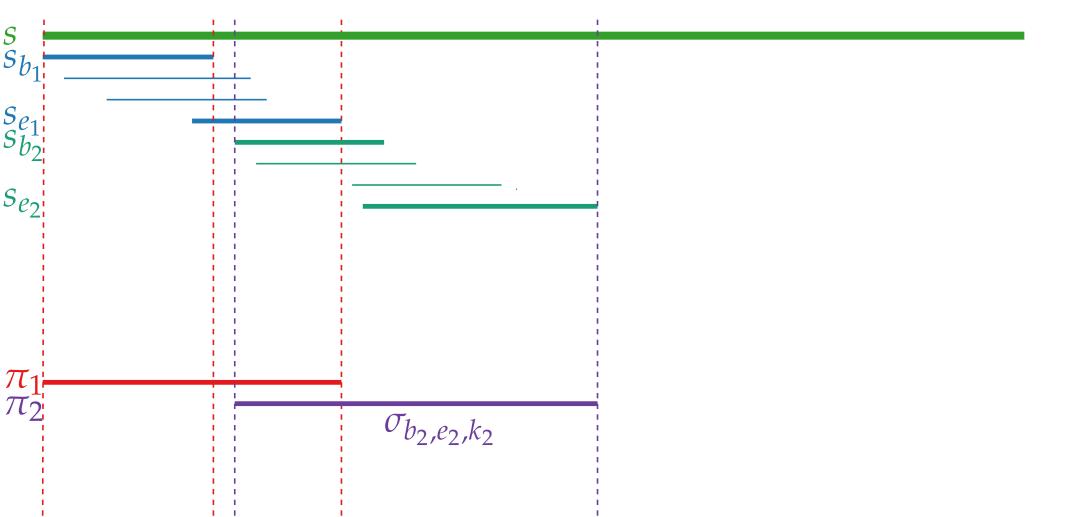


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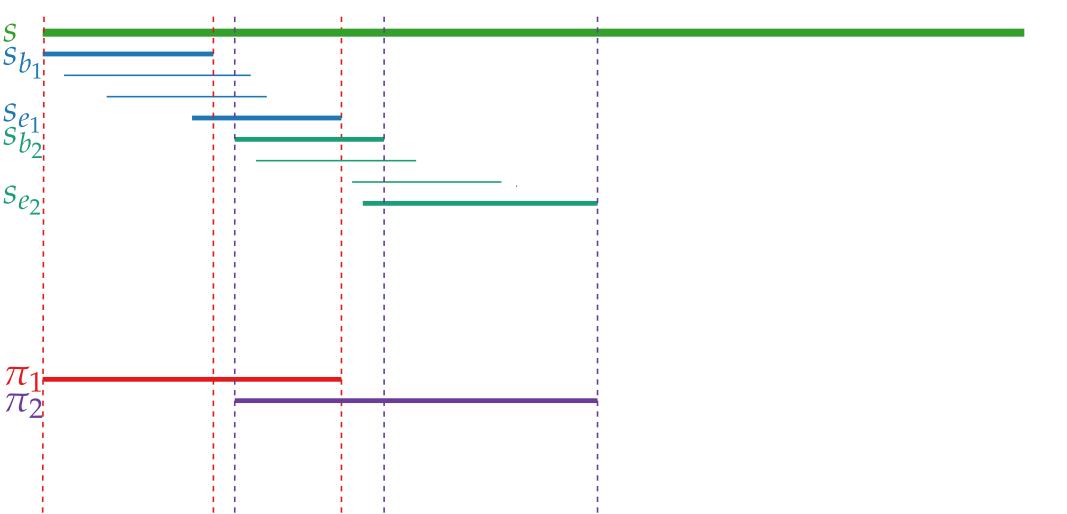


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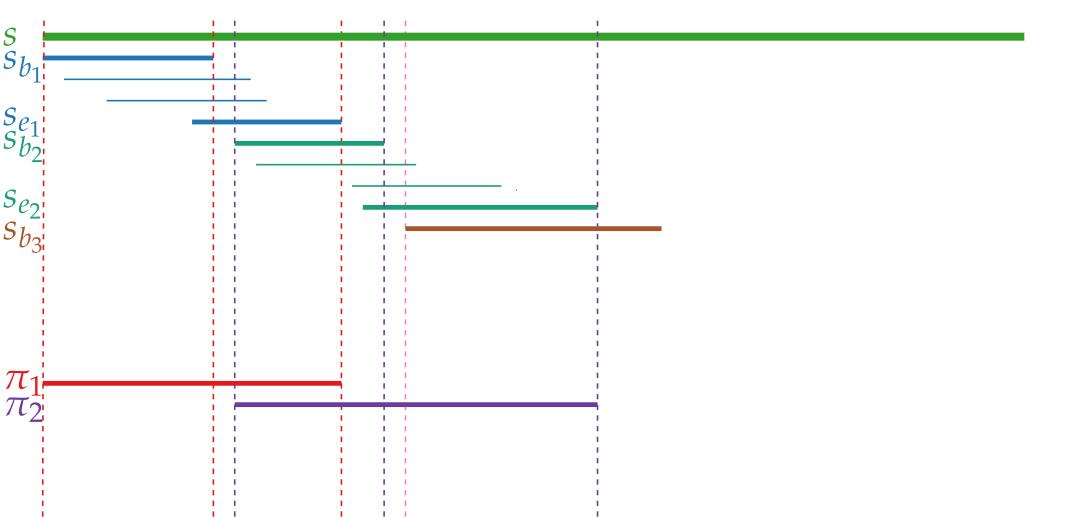


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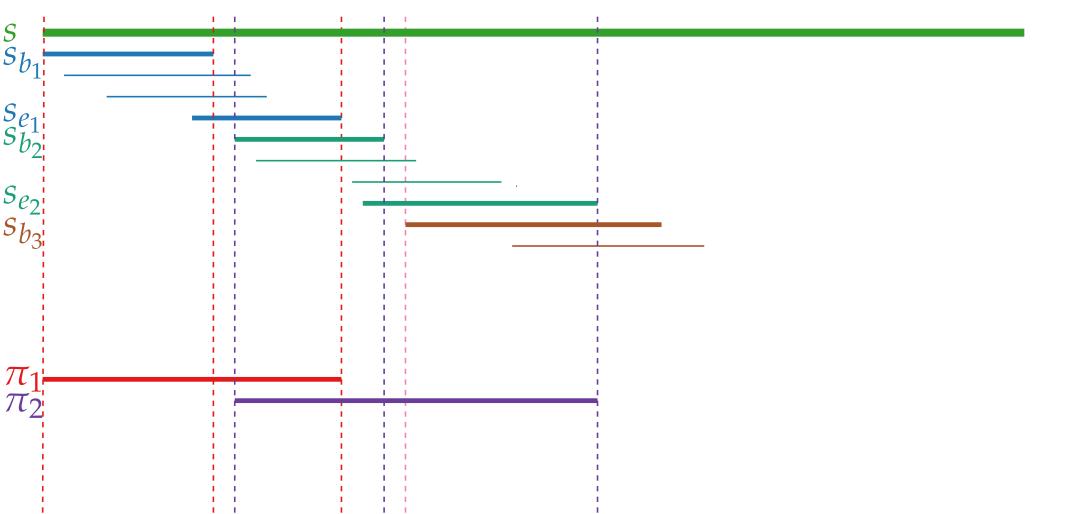


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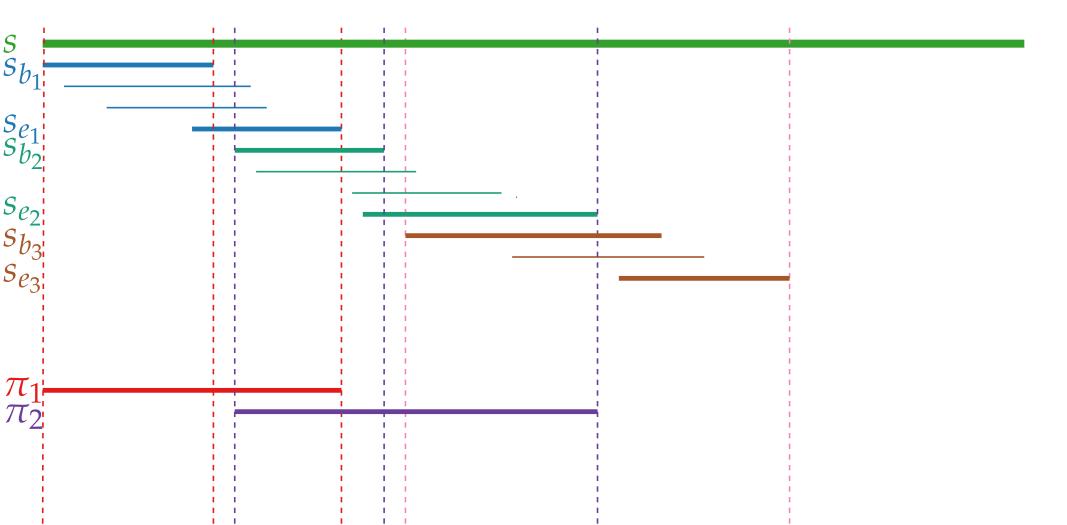


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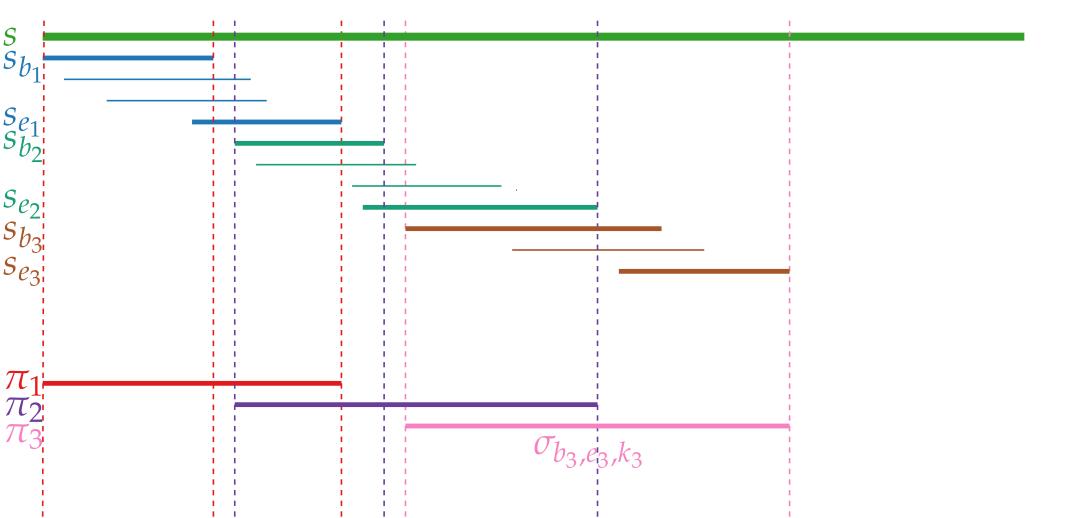


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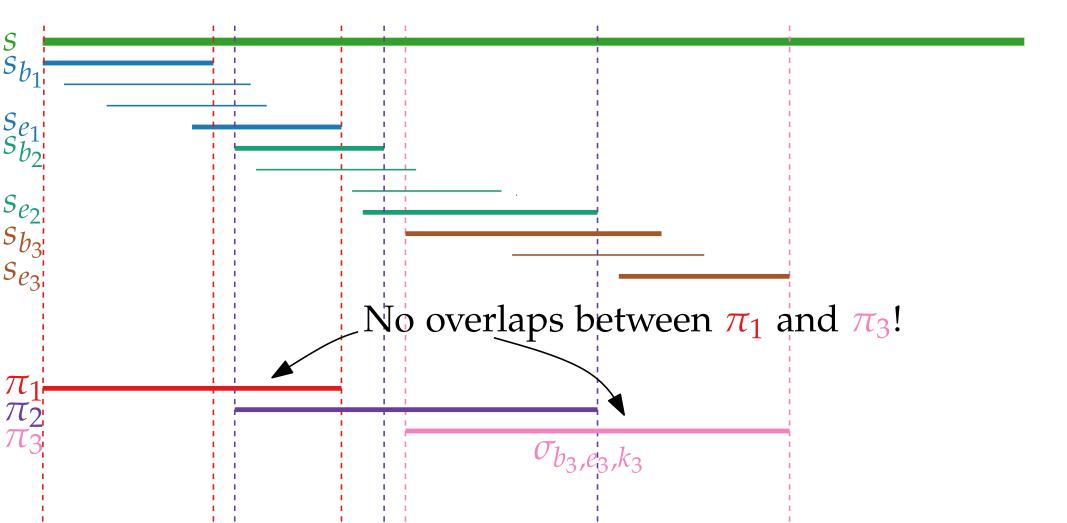


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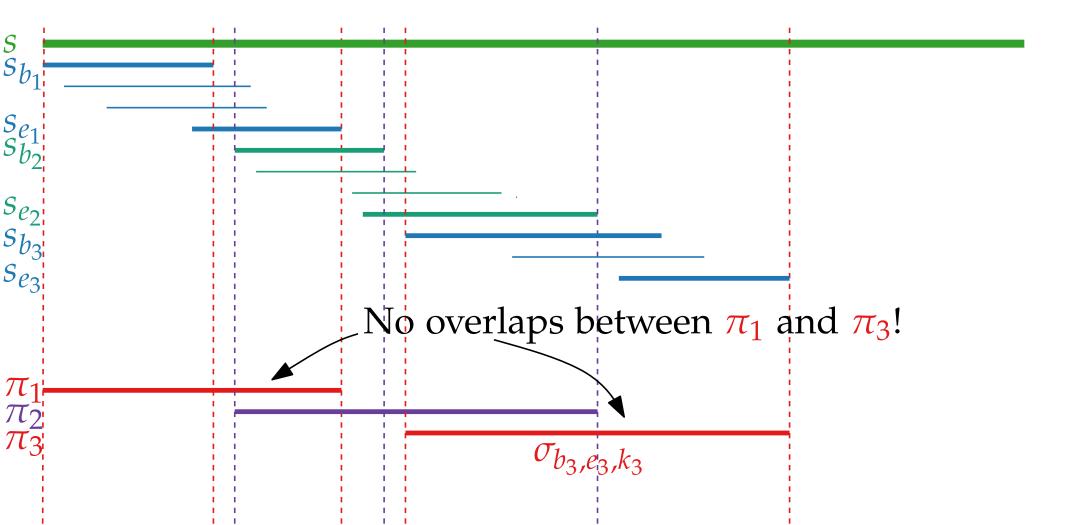


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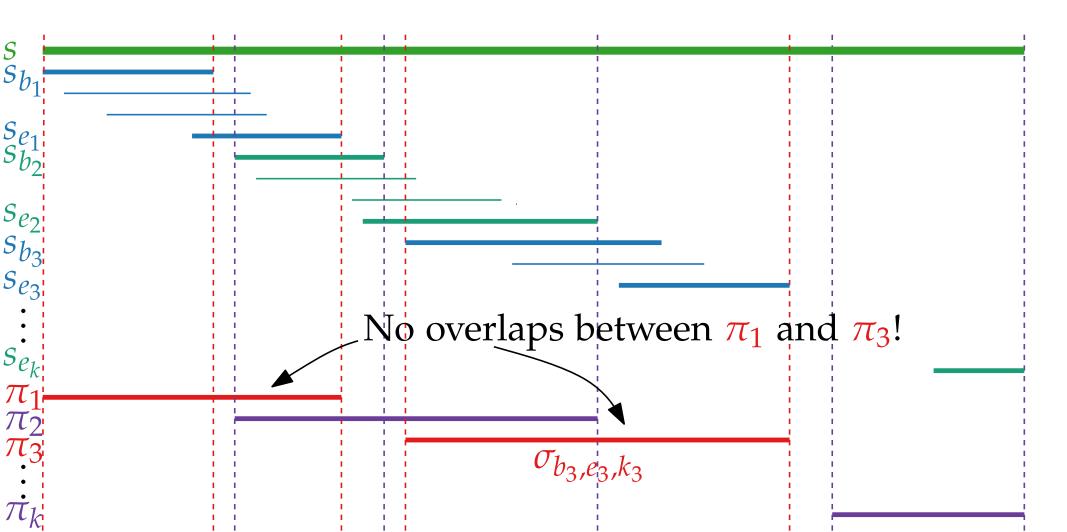


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$$\sum_{i} |\pi_{i}| \leq 2|s| = 2 \cdot \text{OPT}_{SSS}$$

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better?

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better?

The best-known approximation factor for ShortestSuperString is $\frac{71}{30} \approx 2.367$.

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The best-known approximation factor for ShortestSuperString is $\frac{71}{30} \approx 2.367$.

ShortestSuperString cannot be approximation within factor $\frac{333}{332} \approx 1.003$ (unless P=NP).