



Aalto University
School of Science



Combinatorics of
Efficient
Computations

Approximation Algorithms

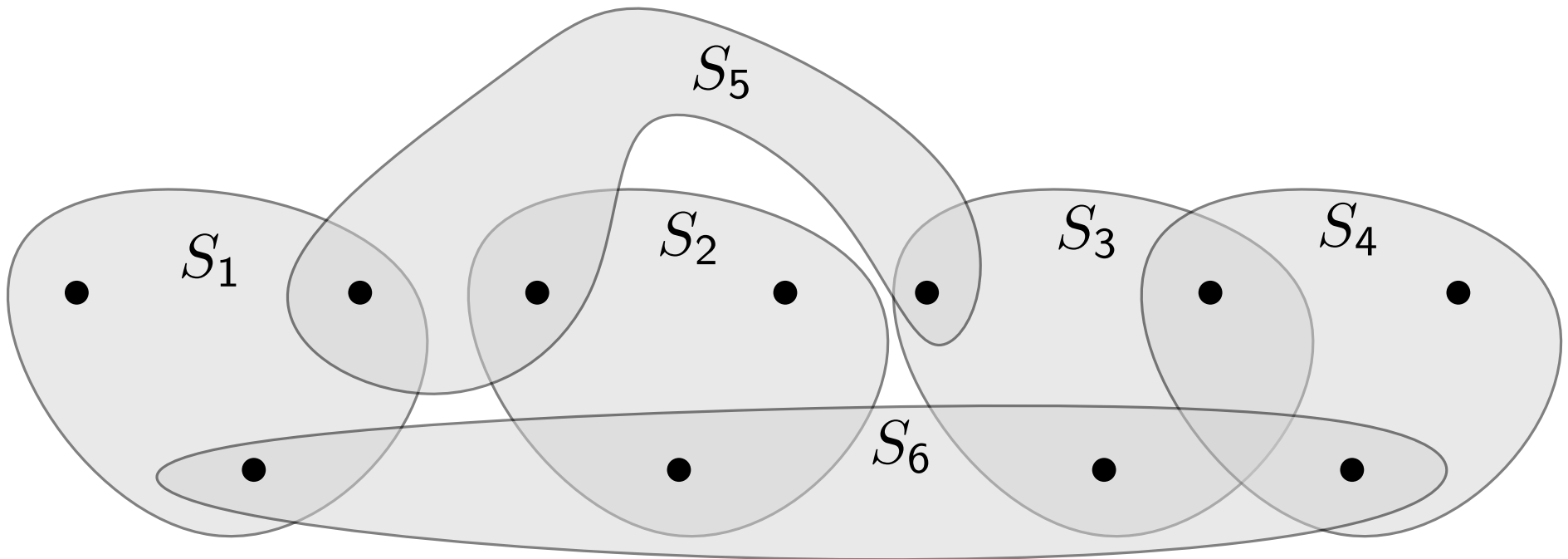
Lecture 2: Set Cover & Shortest SuperString

Joachim Spoerhase

2019

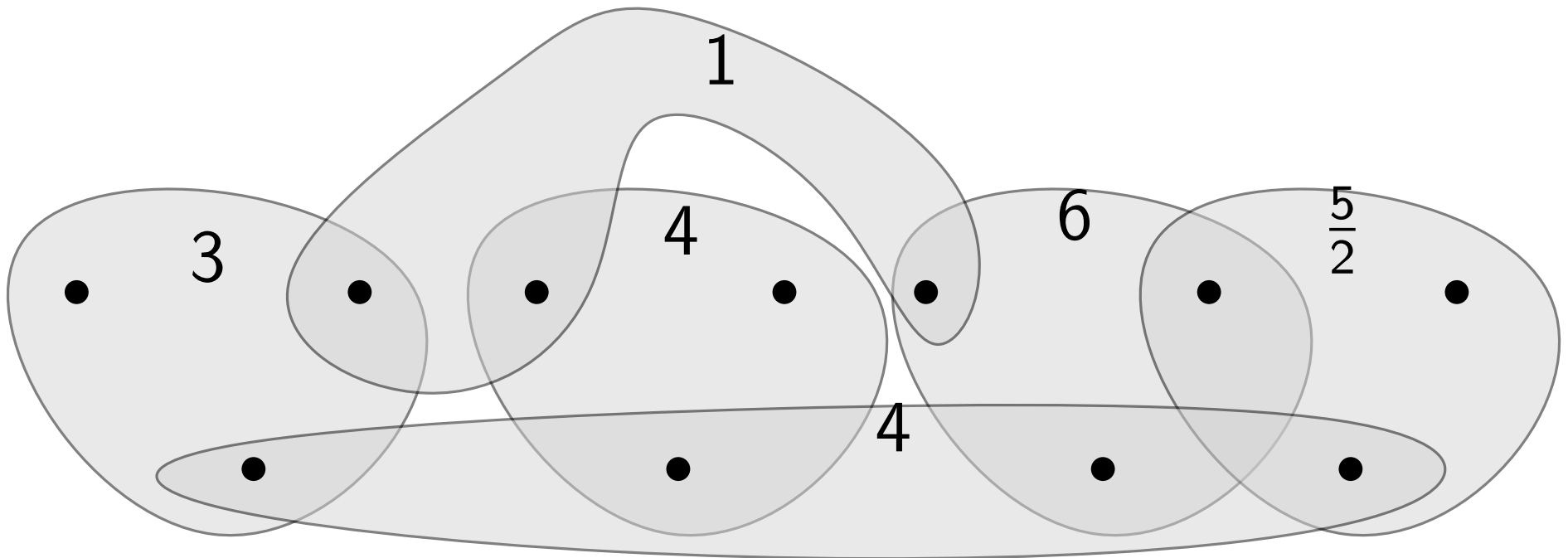
SETCOVER (card.)

- Given a **ground set** U and a collection \mathcal{S} of **subsets** of U where $\bigcup \mathcal{S} = U$.
- Find a **cover** $\mathcal{S}' \subseteq \mathcal{S}$ of U (i.e. with $\bigcup \mathcal{S}' = U$) of minimum cardinality.



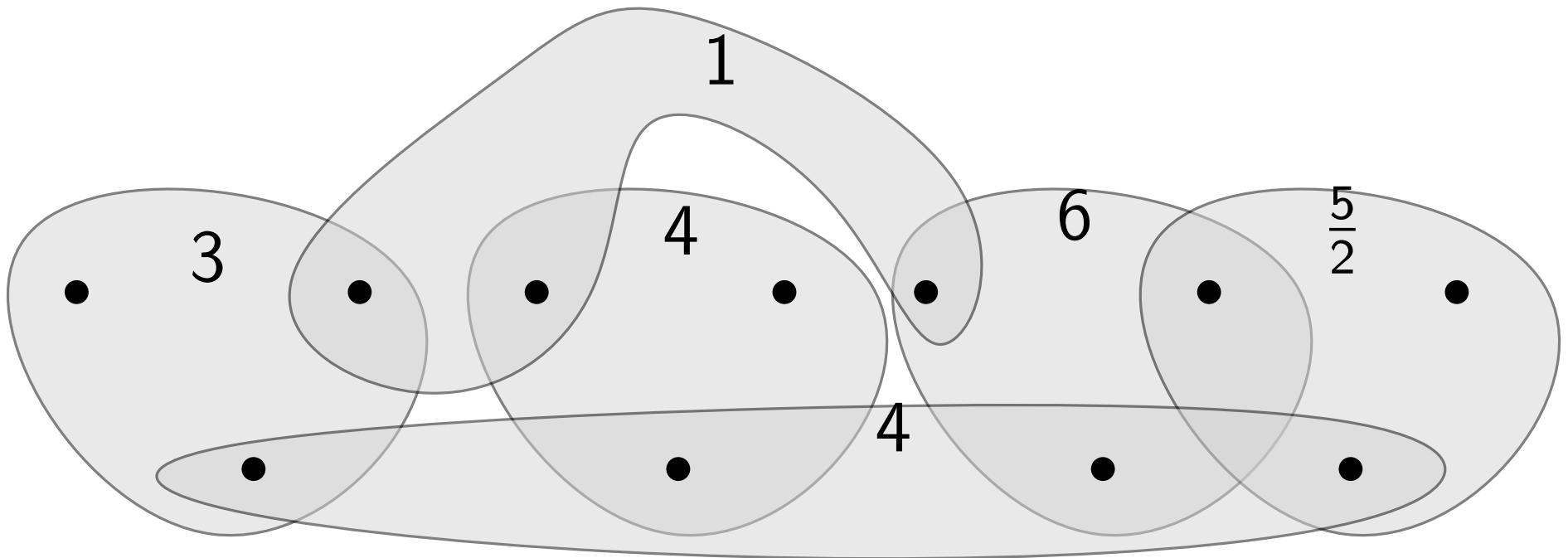
SETCOVER (general)

- Given a **ground set** U and a collection \mathcal{S} of **subsets** of U where $\bigcup \mathcal{S} = U$. **and each $S \in \mathcal{S}$ has a positive cost $c(S)$.**
- Find a **cover** $\mathcal{S}' \subseteq \mathcal{S}$ of U (i.e. with $\bigcup \mathcal{S}' = U$) of minimum ~~cardinality~~. **total cost $c(\mathcal{S}') := \sum_{S \in \mathcal{S}'} c(S)$.**



Iterative “re-pricing”

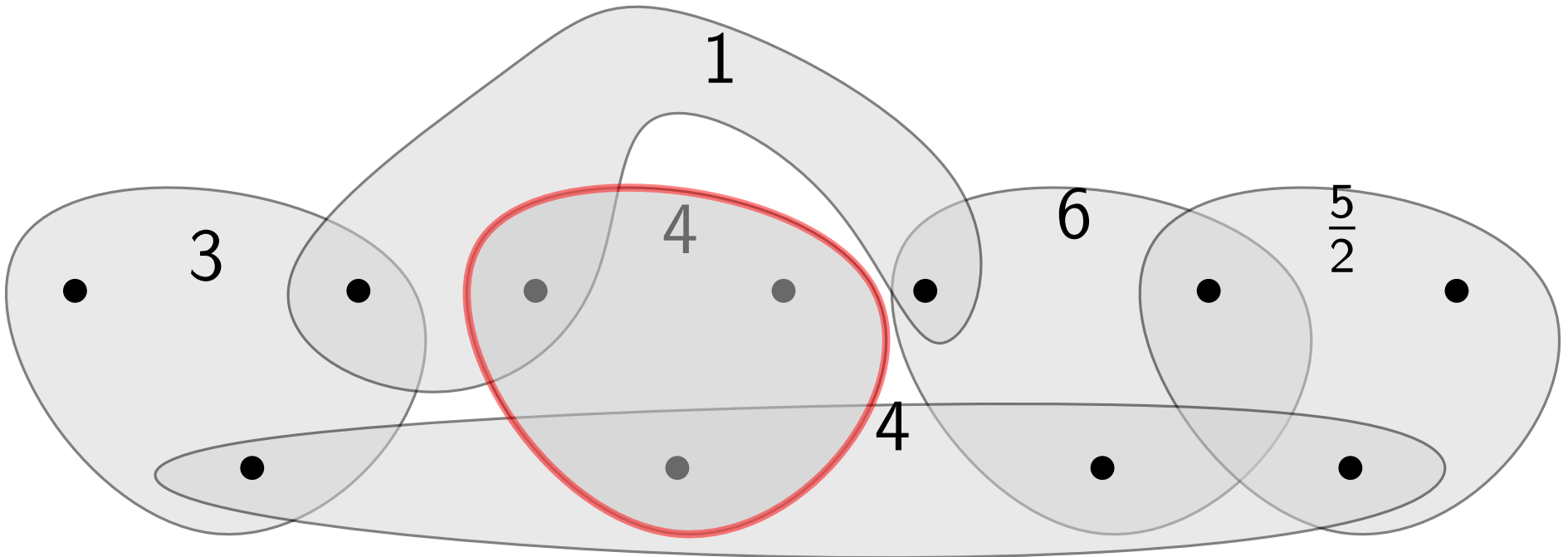
What is the cost of picking a set?



Iterative “re-pricing”

What is the cost of picking a set?

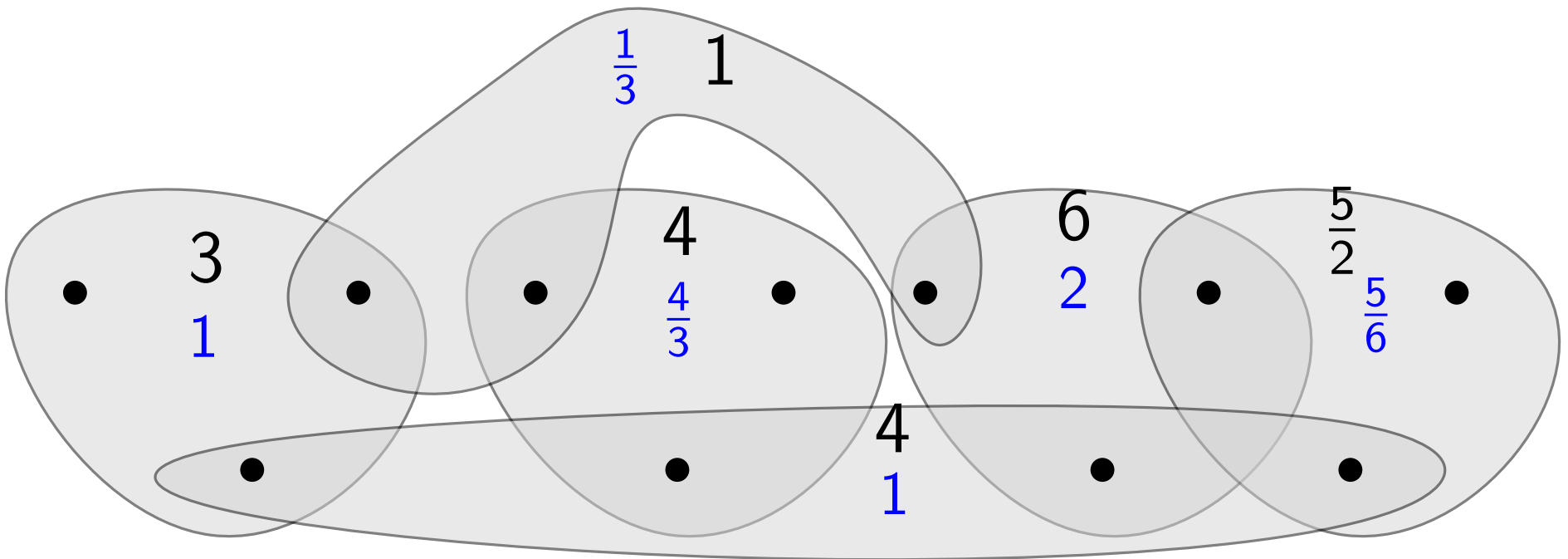
Choosing a 3-element set with cost 4 \rightsquigarrow unit price of $\frac{4}{3}$
i.e., elements of S can be “bought” for a “price” of $\frac{4}{3}$ each.



Iterative “re-pricing”

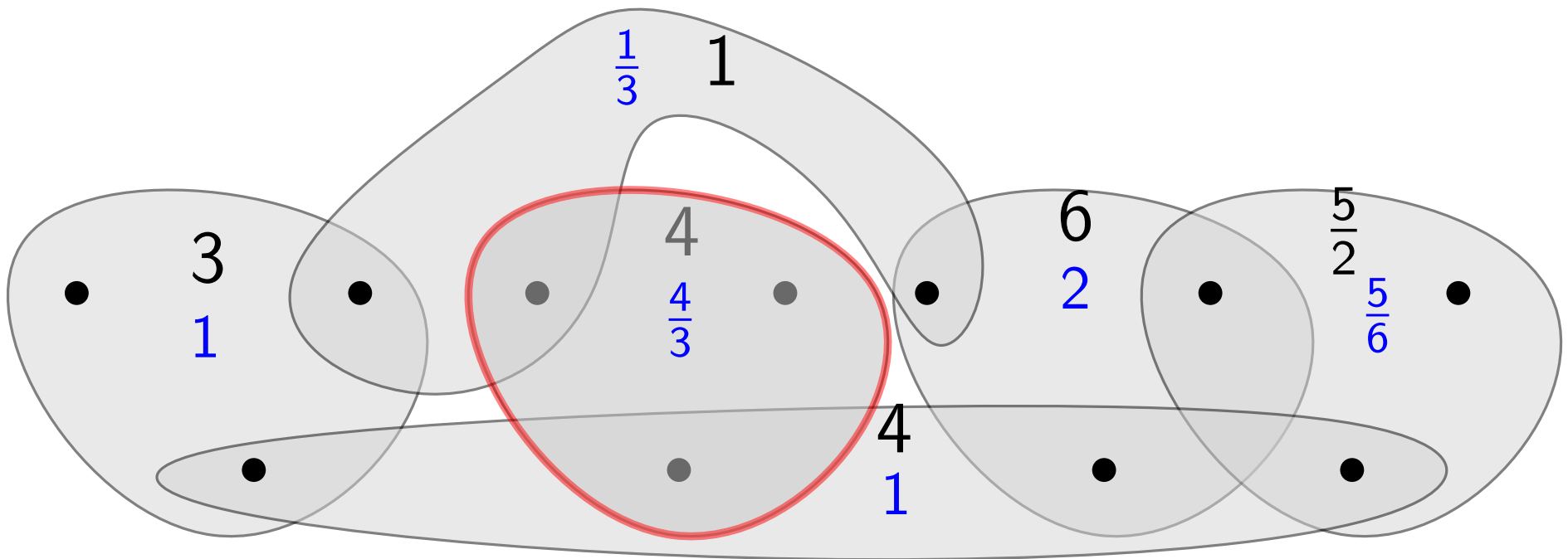
What is the cost of picking a set?

Choosing a 3-element set with cost 4 \rightsquigarrow unit price of $\frac{4}{3}$
i.e., elements of S can be “bought” for a “price” of $\frac{4}{3}$ each.



Iterative “re-pricing”

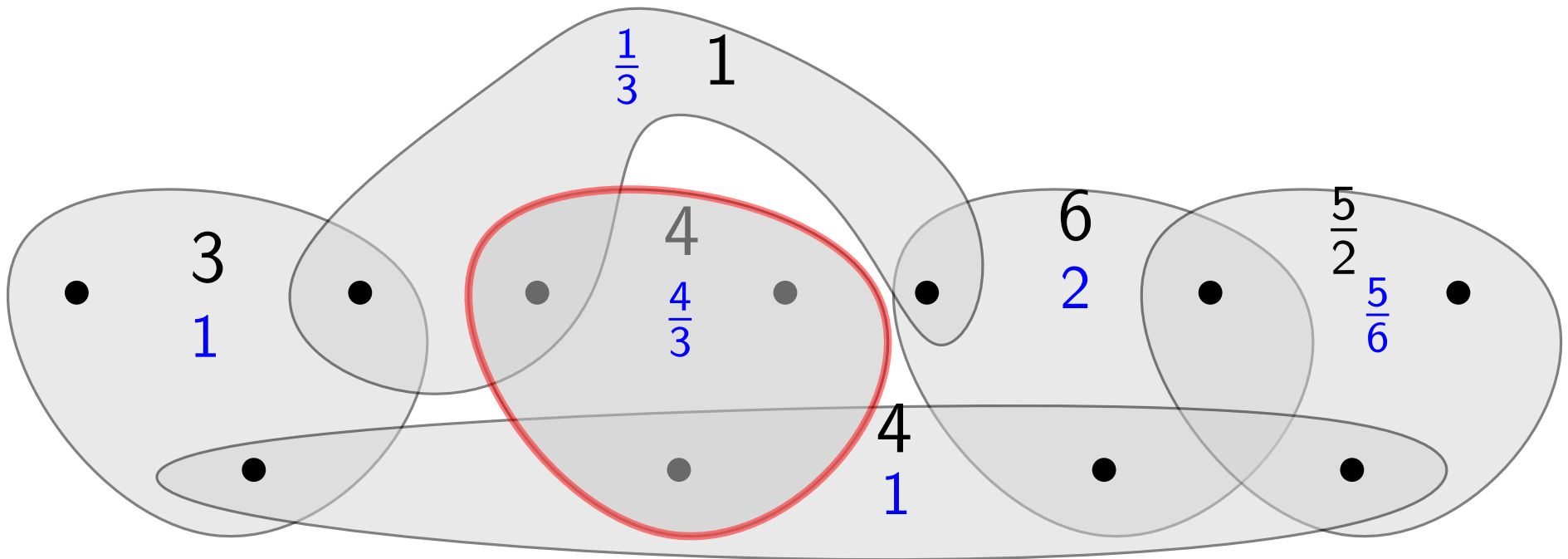
What happens if we “buy” a set?



Iterative “re-pricing”

What happens if we “buy” a set?

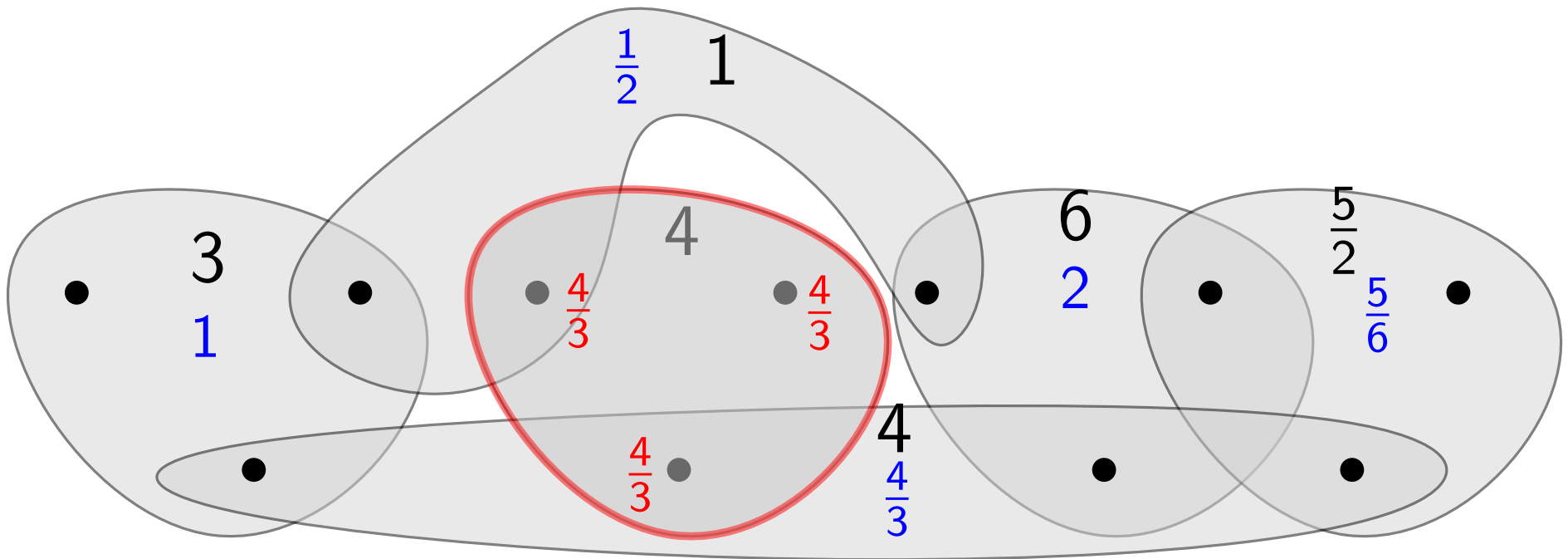
Fix **price** of the elements bought and re-evaluate **unit prices**!



Iterative “re-pricing”

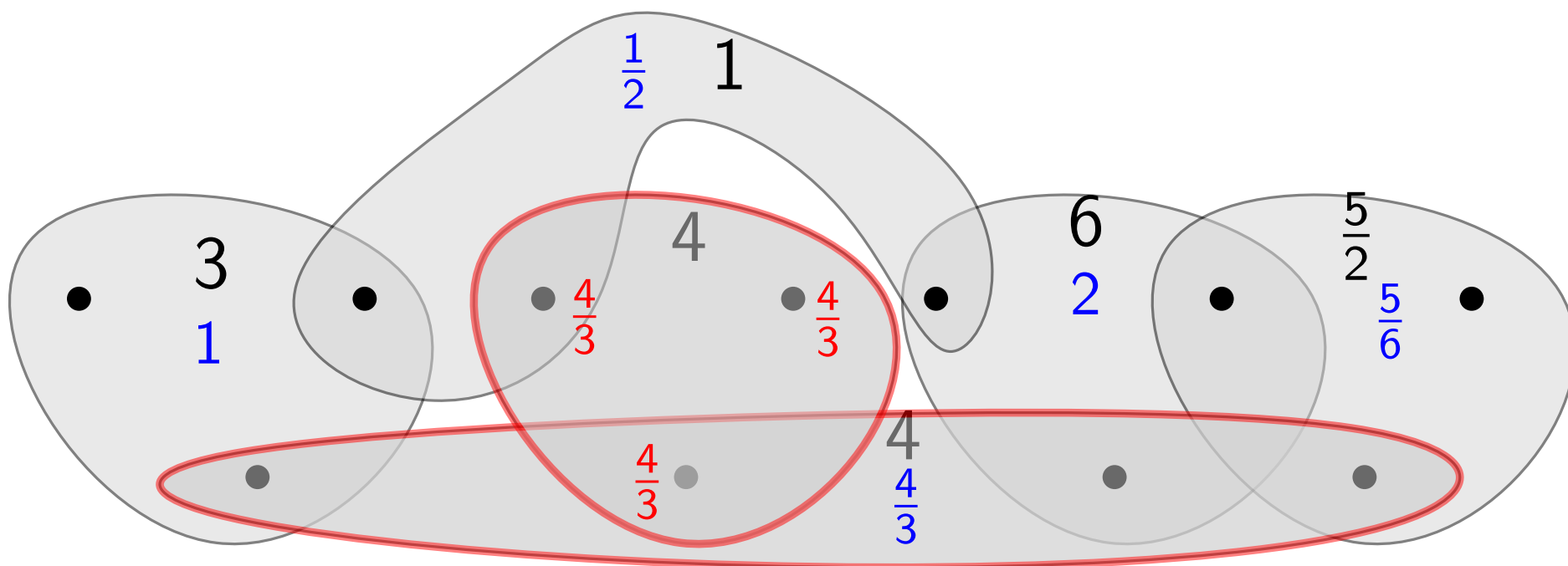
What happens if we “buy” a set?

Fix **price** of the elements bought and re-evaluate **unit prices**!



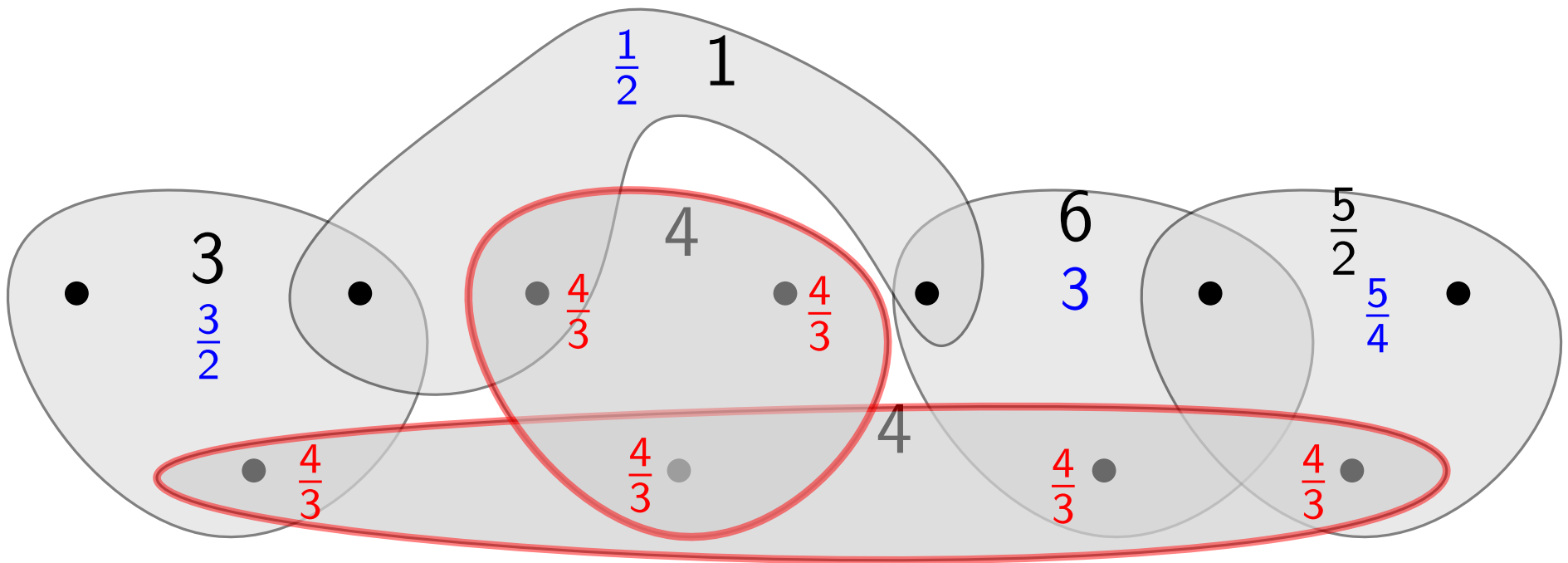
Iterative “re-pricing”

Buy 3 **more** elements for a unit price of $\frac{4}{3}$ and re-price.

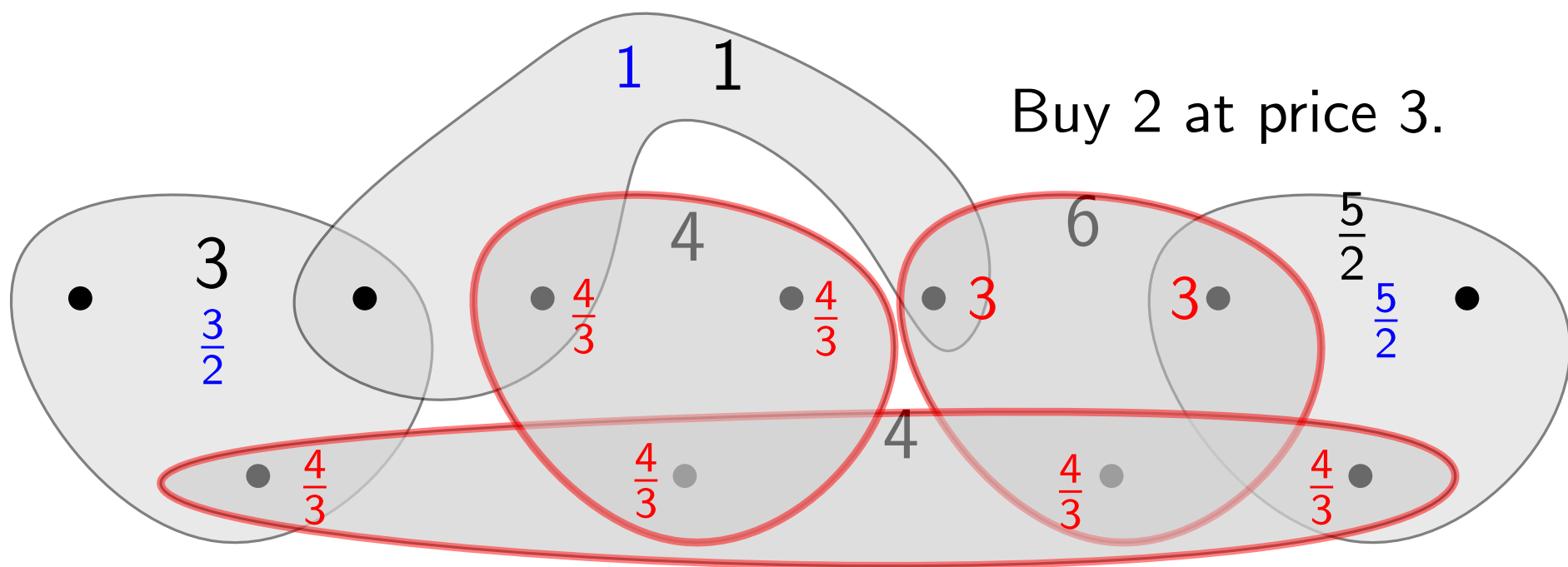


Iterative “re-pricing”

Buy 3 **more** elements for a unit price of $\frac{4}{3}$ and re-price.

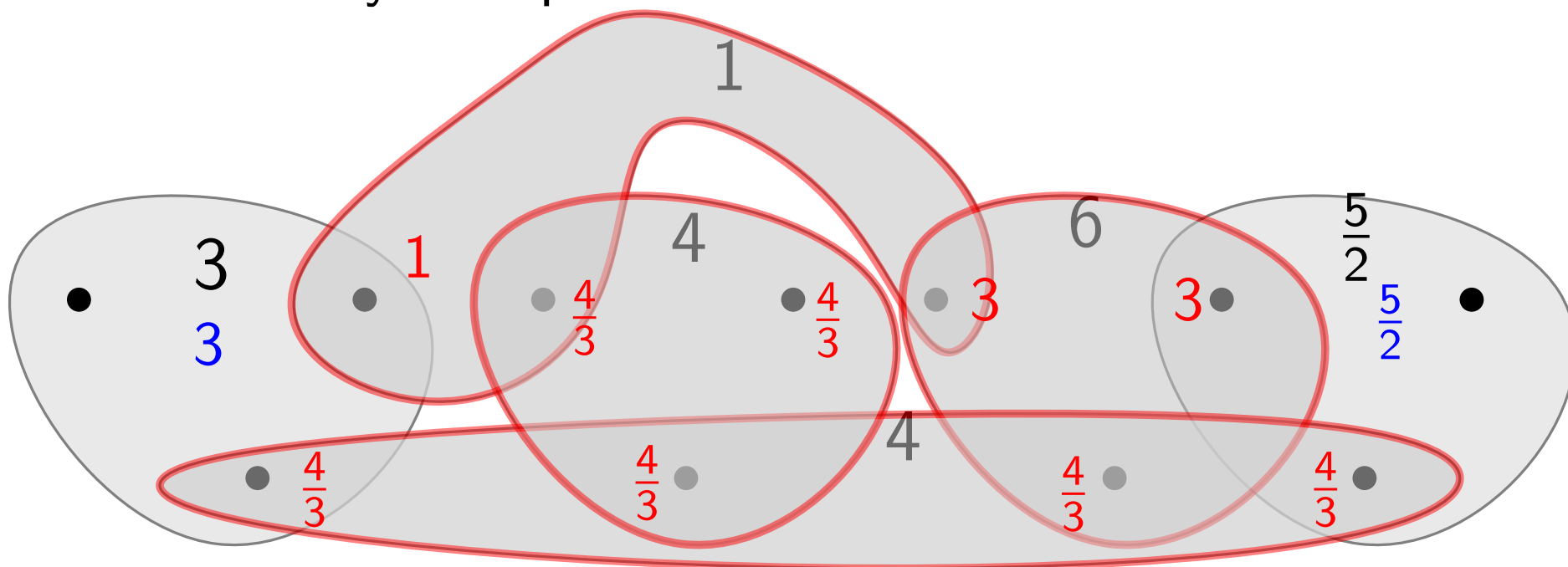


Iterative "re-pricing"



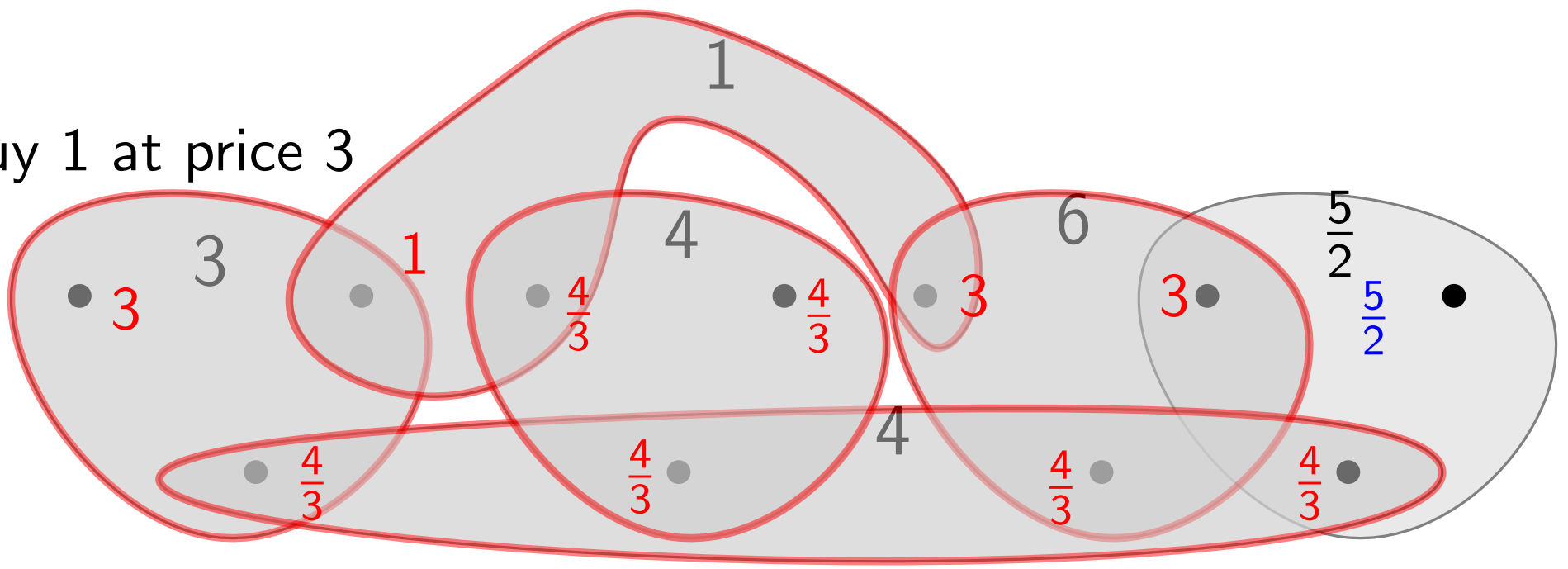
Iterative “re-pricing”

Buy 1 at price 1

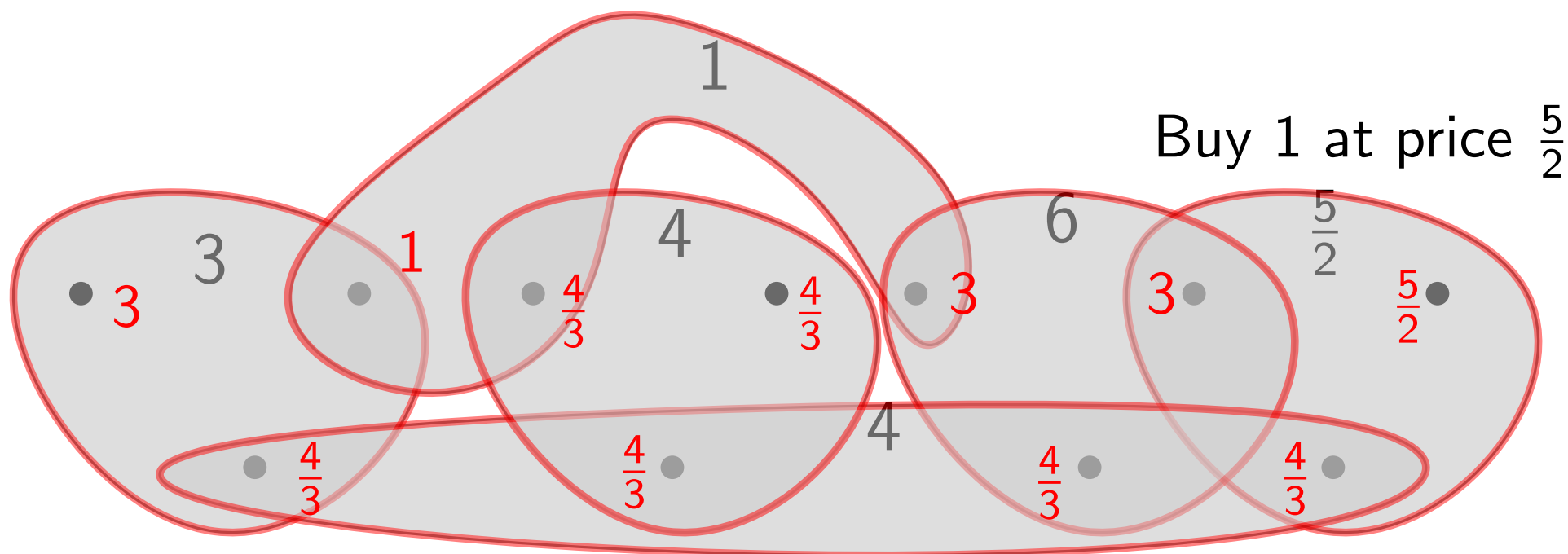


Iterative "re-pricing"

Buy 1 at price 3

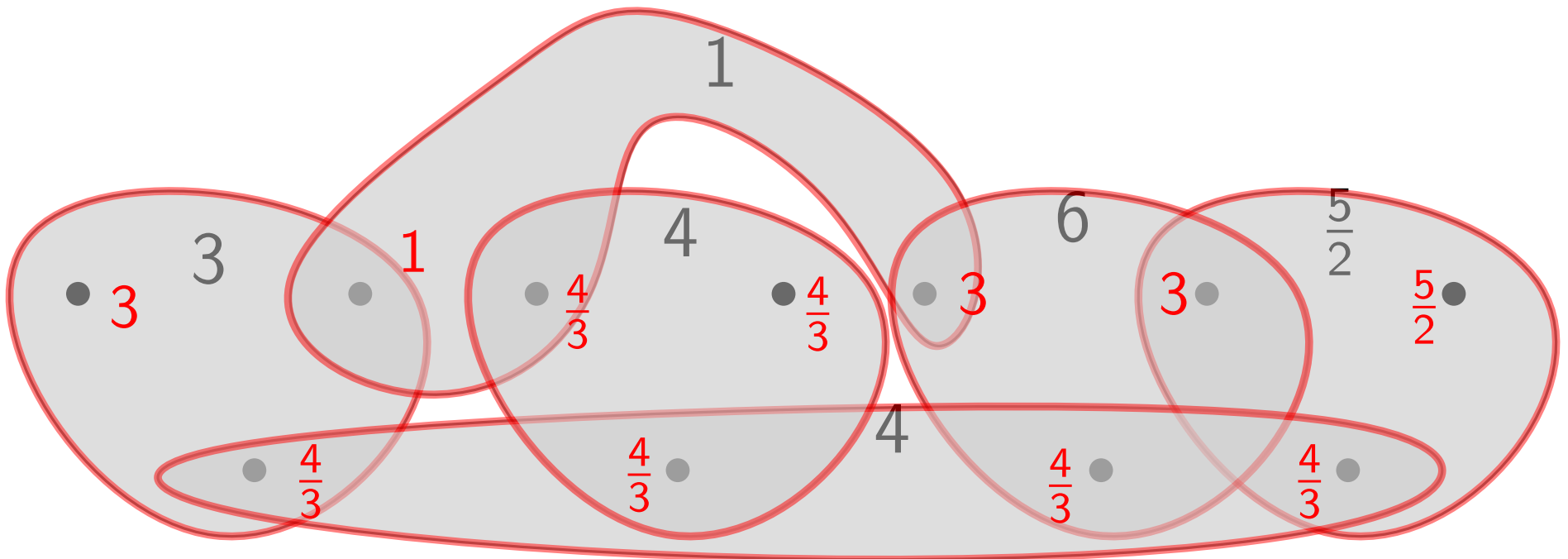


Iterative "re-pricing"



Iterative “re-pricing”

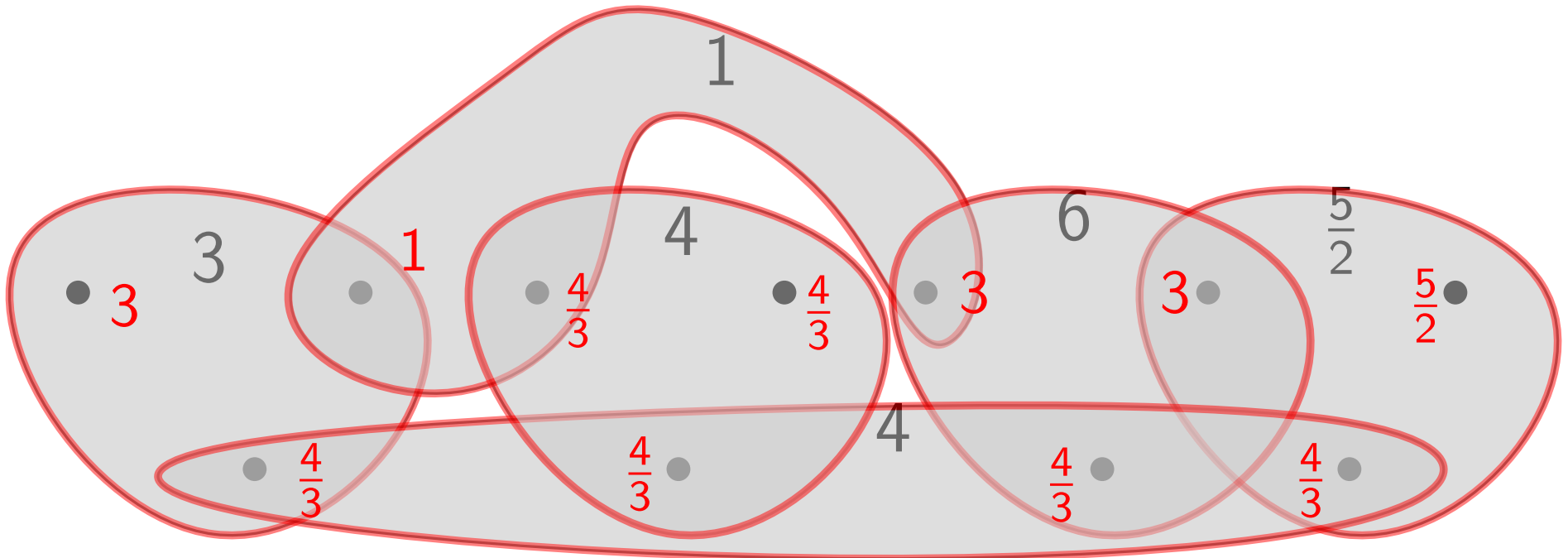
Obs: Total solution cost = $\sum_{e \in U} \text{price}(e)$



Iterative “re-pricing”

Obs: Total solution cost = $\sum_{e \in U} \text{price}(e)$

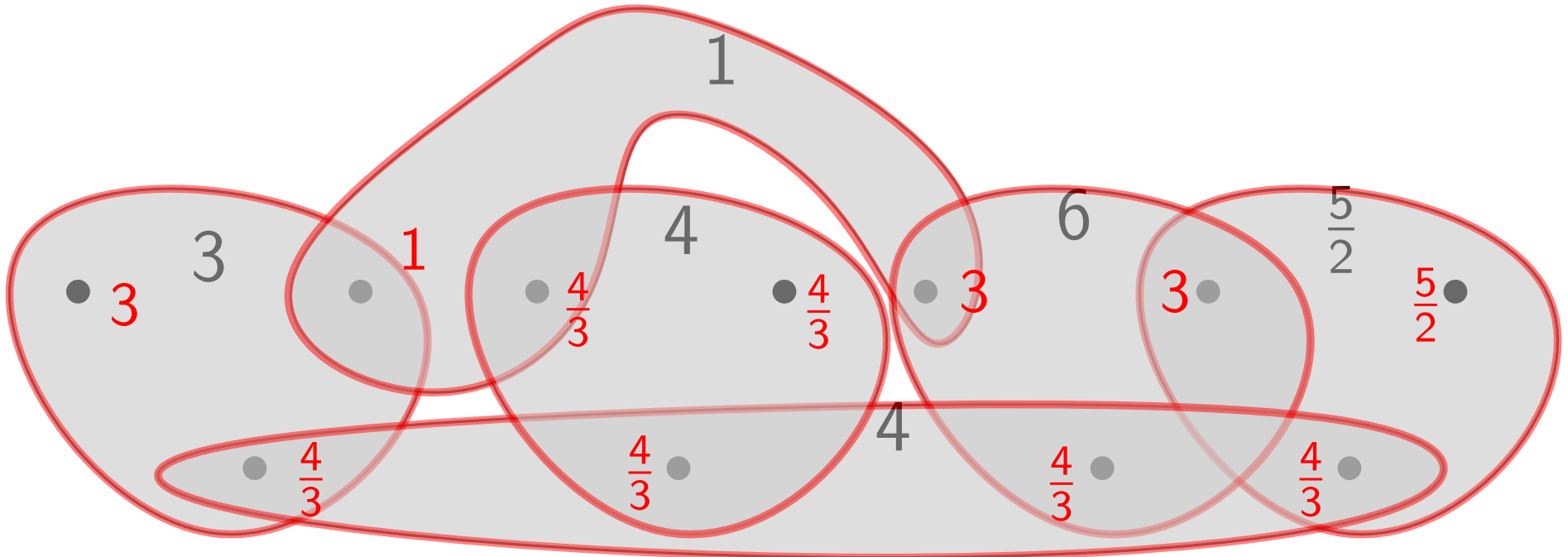
Greedy-Idea: Always choose the set with the cheapest unit price.



Iterative “re-pricing”

Obs: Total solution cost = $\sum_{e \in U} \text{price}(e)$

Greedy-Idea: Always choose the set with the cheapest unit price. Tie-breaking?



Greedy for SETCOVER

GreedySetCover(U, \mathcal{S}, c)

$C \leftarrow \emptyset$

$\mathcal{S}' \leftarrow \emptyset$

while $C \neq U$ **do**

$S \leftarrow$ Set S from \mathcal{S} , with $\frac{c(S)}{|S \setminus C|}$ minimized

foreach $u \in S \setminus C$ **do**

$\text{price}(u) \leftarrow \frac{c(S)}{|S \setminus C|}$

$C \leftarrow C \cup S$

$\mathcal{S}' \leftarrow \mathcal{S}' \cup \{S\}$

return \mathcal{S}'

// Cover of U

Analysis

Thm. GreedySetCover is a factor- \mathcal{H}_k approximation alg. where k is the cardinality of the largest set in \mathcal{S} and $\mathcal{H}_k := 1 + \frac{1}{2} + \frac{1}{3} + \dots + \frac{1}{k} \in O(\log k)$.

Lemma. Let $S \in \mathcal{S}$ and u_1, \dots, u_l be the elements of S in the order they are covered (“bought”) by GreedySetCover. Then

$$\text{price}(u_j) \leq \frac{c(S)}{l-j+1}.$$

Lemma. $\text{price}(S) := \sum_{i=1}^l \text{price}(u_i) \leq \mathcal{H}_l \cdot c(S)$

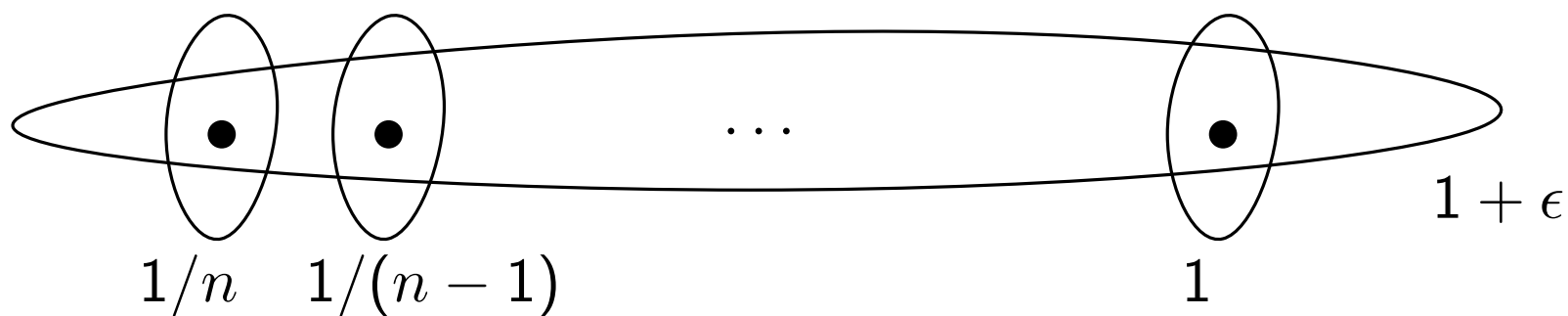
Is the Analysis of Greedy Tight?

Question: Does there exist a set cover instance where our greedy algorithm performs as bad (asymptotically) as our performance guarantee?

Is the Analysis of Greedy Tight?

Question: Does there exist a set cover instance where our greedy algorithm performs as bad (asymptotically) as our performance guarantee?

Yes :-)



SHORTEST SUPERSTRING (SSS)

Given a collection $\mathcal{S} = \{s_1, \dots, s_n\}$ of strings over a finite alphabet Σ (i.e., $\mathcal{S} \subseteq \Sigma^+$).

Find a *shortest string* s such that each s_i is a *substring* of s .

SHORTEST SUPERSTRING (SSS)

Given a collection $\mathcal{S} = \{s_1, \dots, s_n\}$ of strings over a finite alphabet Σ (i.e., $\mathcal{S} \subseteq \Sigma^+$).

Find a *shortest string* s such that each s_i is a *substring* of s .

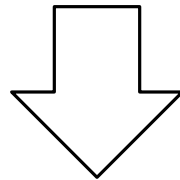
e.g.: $U := \{cbaa, abc, bcb\}$

SHORTEST SUPERSTRING (SSS)

Given a collection $\mathcal{S} = \{s_1, \dots, s_n\}$ of strings over a finite alphabet Σ (i.e., $\mathcal{S} \subseteq \Sigma^+$).

Find a *shortest string* s such that each s_i is a *substring* of s .

e.g.: $U := \{cbaa, abc, bcb\}$



$s = abcbaa$

abc

bcb

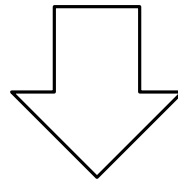
$cbaa$

SHORTEST SUPERSTRING (SSS)

Given a collection $\mathcal{S} = \{s_1, \dots, s_n\}$ of strings over a finite alphabet Σ (i.e., $\mathcal{S} \subseteq \Sigma^+$).

Find a *shortest string* s such that each s_i is a *substring* of s .

e.g.: $U := \{cbaa, abc, bcb\}$



note: s “covers” the strings in U

$s = abcbaa$

abc

bcb

$cbaa$

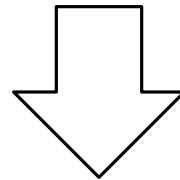
SHORTEST SUPERSTRING (SSS)

Given a collection $\mathcal{S} = \{s_1, \dots, s_n\}$ of strings over a finite alphabet Σ (i.e., $\mathcal{S} \subseteq \Sigma^+$).

Find a *shortest string* s such that each s_i is a *substring* of s .

e.g.: $U := \{cbaa, abc, bcb\}$

WLOG: No string s_i is a substring of any other string s_j .



note: s “covers” the strings in U

$s = abcbaa$
abc
bcb
cbaa

SSS as a SETCOVER problem

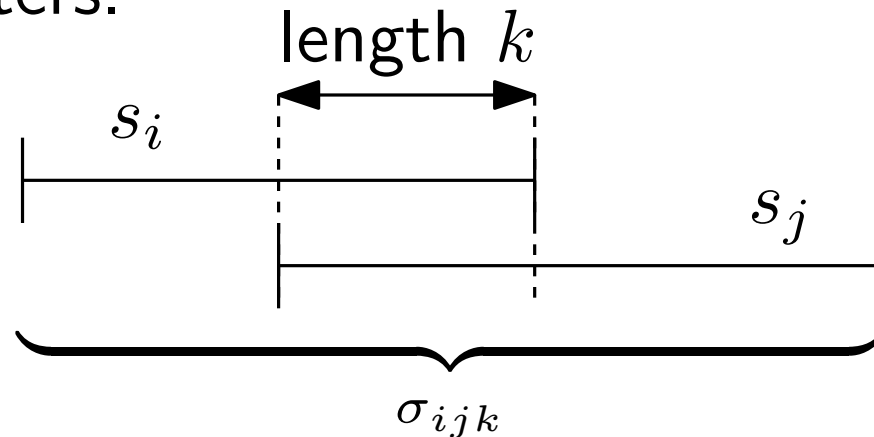
- SETCOVER Instance: ground set U , set family \mathcal{S} , costs c .

SSS as a SETCOVER problem

- SETCOVER Instance: ground set U , set family \mathcal{S} , costs c .
- ground set $U := \{s_1, \dots, s_n\}$

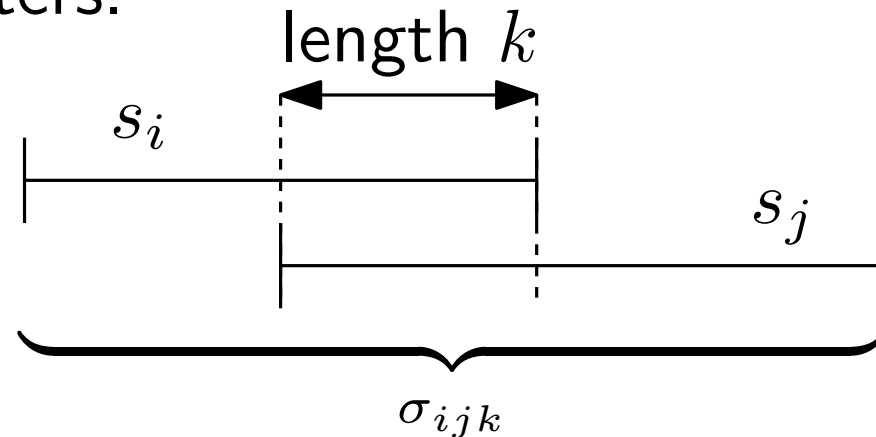
SSS as a SETCOVER problem

- SETCOVER Instance: ground set U , set family \mathcal{S} , costs c .
- ground set $U := \{s_1, \dots, s_n\}$
- a string σ_{ijk} has prefix s_i , suffix s_j where s_i and s_j overlap on k characters.



SSS as a SETCOVER problem

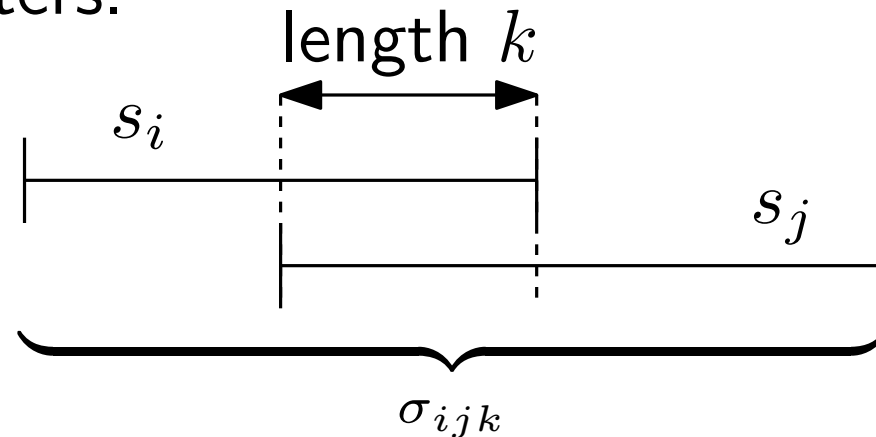
- SETCOVER Instance: ground set U , set family \mathcal{S} , costs c .
- ground set $U := \{s_1, \dots, s_n\}$
- a string σ_{ijk} has prefix s_i , suffix s_j where s_i and s_j overlap on k characters.



- for each σ_{ijk} let $\text{set}(\sigma_{ijk}) = \{s \in U \mid s \text{ substring of } \sigma_{ijk}\}$, i.e., the ground elements covered by σ_{ijk} .

SSS as a SETCOVER problem

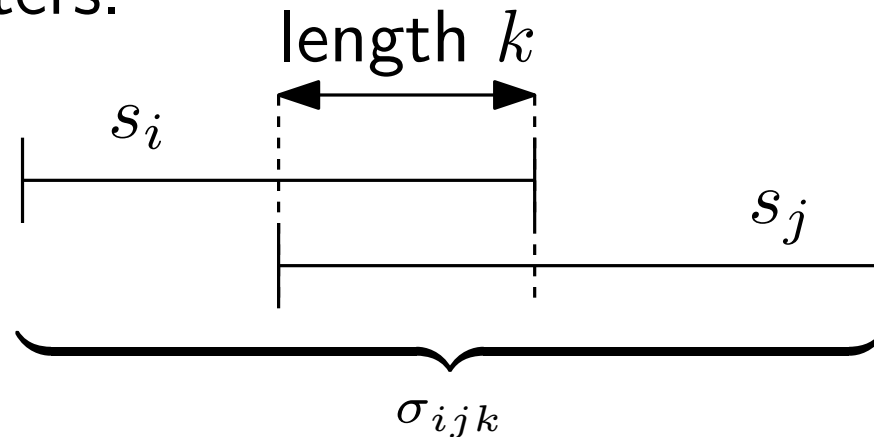
- SETCOVER Instance: ground set U , set family \mathcal{S} , costs c .
- ground set $U := \{s_1, \dots, s_n\}$
- a string σ_{ijk} has prefix s_i , suffix s_j where s_i and s_j overlap on k characters.



- for each σ_{ijk} let $\text{set}(\sigma_{ijk}) = \{s \in U \mid s \text{ substring of } \sigma_{ijk}\}$, i.e., the ground elements covered by σ_{ijk} .
- cost of σ_{ijk} is $|\sigma_{ijk}|$

SSS as a SETCOVER problem

- SETCOVER Instance: ground set U , set family \mathcal{S} , costs c .
- ground set $U := \{s_1, \dots, s_n\}$
- a string σ_{ijk} has prefix s_i , suffix s_j where s_i and s_j overlap on k characters.



- for each σ_{ijk} let $\text{set}(\sigma_{ijk}) = \{s \in U \mid s \text{ substring of } \sigma_{ijk}\}$, i.e., the ground elements covered by σ_{ijk} .
- cost of σ_{ijk} is $|\sigma_{ijk}|$
- set family $\mathcal{S} = \{\text{set}(\sigma_{ijk}) \mid \text{for valid choices of } i, j \text{ (possibly } i = j) \text{ and } k > 0\}$.

Relating SSS and SETCOVER

Lemma. Let OPT be the length of a shortest superstring of U and OPT_{SC} be the minimum cost of the corresponding SETCOVER-Instance. Then:

$$OPT \leq OPT_{SC}$$

Relating SSS and SETCOVER

Lemma. Let OPT be the length of a shortest superstring of U and OPT_{SC} be the minimum cost of the corresponding SETCOVER-Instance. Then:

$$\text{OPT} \leq \text{OPT}_{\text{SC}}$$

Proof.

- Consider an optimal set cover $\text{set}(\pi_1), \dots, \text{set}(\pi_k)$ of U .

Relating SSS and SETCOVER

Lemma. Let OPT be the length of a shortest superstring of U and OPT_{SC} be the minimum cost of the corresponding SETCOVER-Instance. Then:

$$\text{OPT} \leq \text{OPT}_{\text{SC}}$$

Proof.

- Consider an optimal set cover $\text{set}(\pi_1), \dots, \text{set}(\pi_k)$ of U .
- $s := \pi_1 \circ \dots \circ \pi_k$ is a superstring of U whose length is $\text{OPT}_{\text{SC}} = \sum_{i=1}^k |\pi_i|$

Relating SSS and SETCOVER

Lemma. Let OPT be the length of a shortest superstring of U and OPT_{SC} be the minimum cost of the corresponding SETCOVER-Instance. Then:

$$\text{OPT} \leq \text{OPT}_{\text{SC}}$$

Proof.

- Consider an optimal set cover $\text{set}(\pi_1), \dots, \text{set}(\pi_k)$ of U .
- $s := \pi_1 \circ \dots \circ \pi_k$ is a superstring of U whose length is $\text{OPT}_{\text{SC}} = \sum_{i=1}^k |\pi_i|$
- Thus, $\text{OPT} \leq |s| = \text{OPT}_{\text{SC}}$

Relating SSS and SETCOVER

Lemma. Let OPT be the length of a shortest superstring of U and OPT_{SC} be the minimum cost of the corresponding SETCOVER-Instance. Then:

$$\text{OPT} \leq \text{OPT}_{\text{SC}}$$

Proof.

- Consider an optimal set cover $\text{set}(\pi_1), \dots, \text{set}(\pi_k)$ of U .
- $s := \pi_1 \circ \dots \circ \pi_k$ is a superstring of U whose length is $\text{OPT}_{\text{SC}} = \sum_{i=1}^k |\pi_i|$
- Thus, $\text{OPT} \leq |s| = \text{OPT}_{\text{SC}}$



Relating SSS and SETCOVER

Lemma.

$$\text{OPT}_{\text{SC}} \leq 2 \cdot \text{OPT}$$

Relating SSS and SETCOVER

Lemma.

$$\text{OPT}_{\text{SC}} \leq 2 \cdot \text{OPT}$$

Proof.

Let s be an optimal superstring. Construct set cover with:

$$\text{cost} \leq 2|s| = 2 \cdot \text{OPT}.$$

Relating SSS and SETCOVER

Lemma.

$$\text{OPT}_{\text{SC}} \leq 2 \cdot \text{OPT}$$

Proof.

Let s be an optimal superstring. Construct set cover with:

$$\text{cost} \leq 2|s| = 2 \cdot \text{OPT}.$$



Relating SSS and SETCOVER

Lemma.

$$\text{OPT}_{\text{SC}} \leq 2 \cdot \text{OPT}$$

Proof.

Let s be an optimal superstring. Construct set cover with:

$$\text{cost} \leq 2|s| = 2 \cdot \text{OPT}.$$



Relating SSS and SETCOVER

Lemma.

$$\text{OPT}_{\text{SC}} \leq 2 \cdot \text{OPT}$$

Proof.

Let s be an optimal superstring. Construct set cover with:

$$\text{cost} \leq 2|s| = 2 \cdot \text{OPT}.$$



Relating SSS and SETCOVER

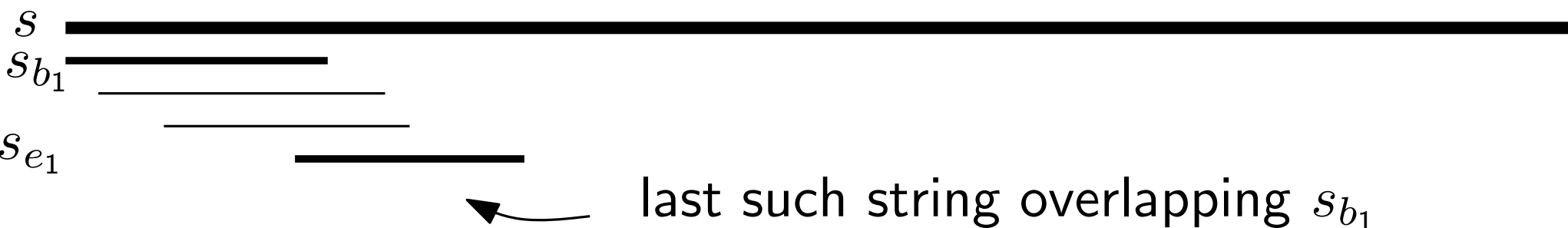
Lemma.

$$\text{OPT}_{\text{SC}} \leq 2 \cdot \text{OPT}$$

Proof.

Let s be an optimal superstring. Construct set cover with:

$$\text{cost} \leq 2|s| = 2 \cdot \text{OPT}.$$



Relating SSS and SETCOVER

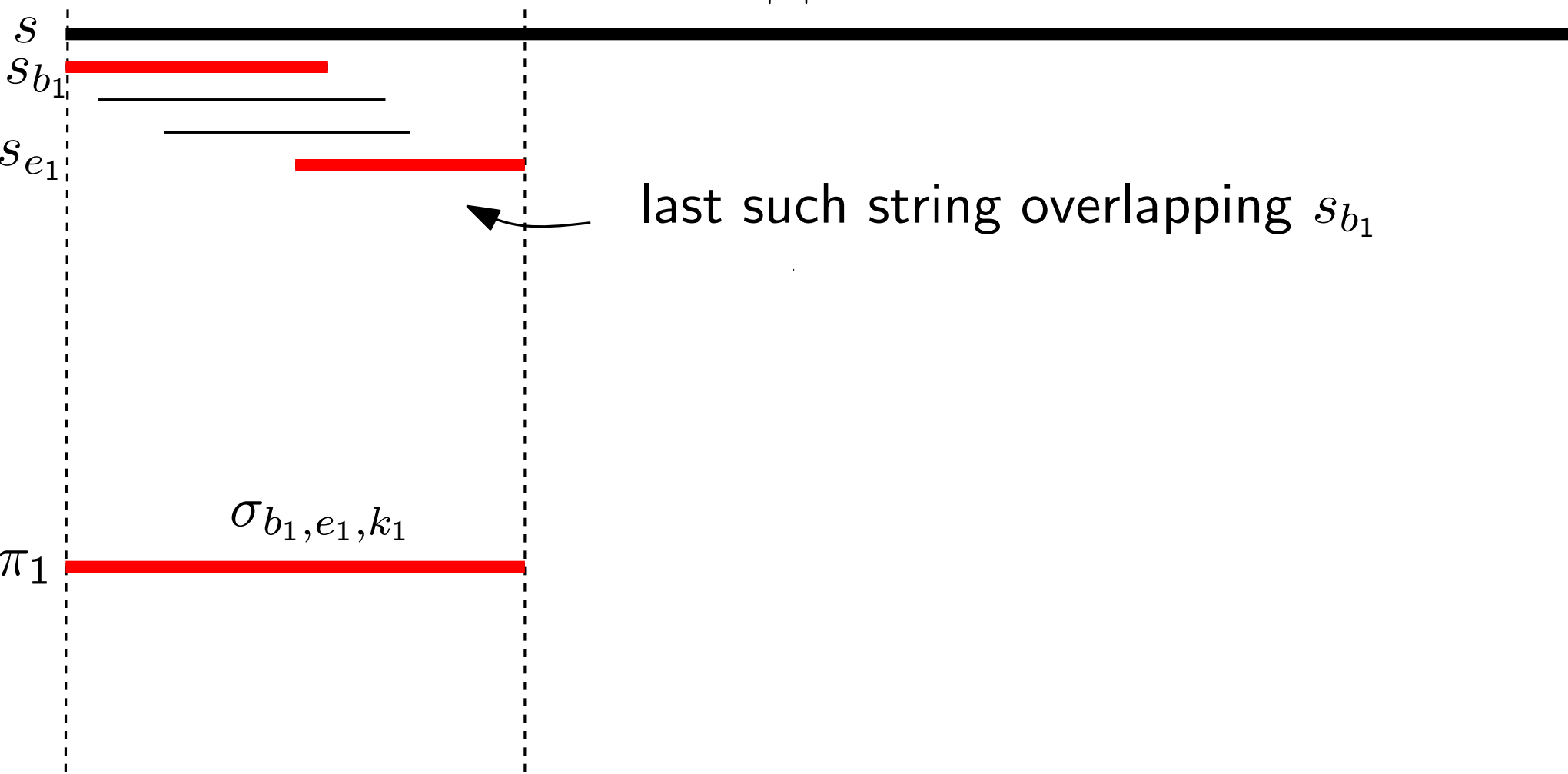
Lemma.

$$\text{OPT}_{\text{SC}} \leq 2 \cdot \text{OPT}$$

Proof.

Let s be an optimal superstring. Construct set cover with:

$$\text{cost} \leq 2|s| = 2 \cdot \text{OPT}.$$



Relating SSS and SETCOVER

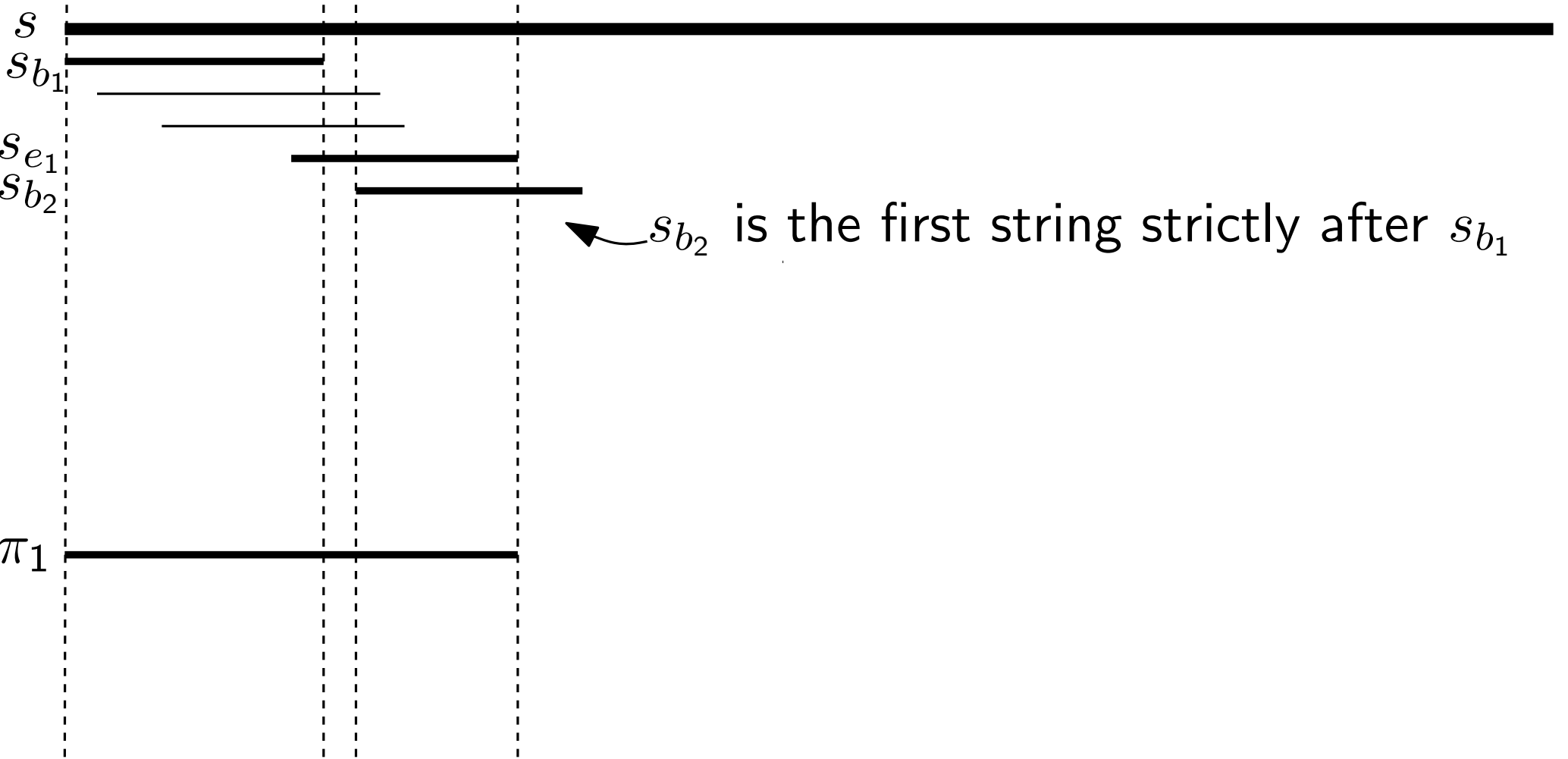
Lemma.

$$\text{OPT}_{\text{SC}} \leq 2 \cdot \text{OPT}$$

Proof.

Let s be an optimal superstring. Construct set cover with:

$$\text{cost} \leq 2|s| = 2 \cdot \text{OPT}.$$



Relating SSS and SETCOVER

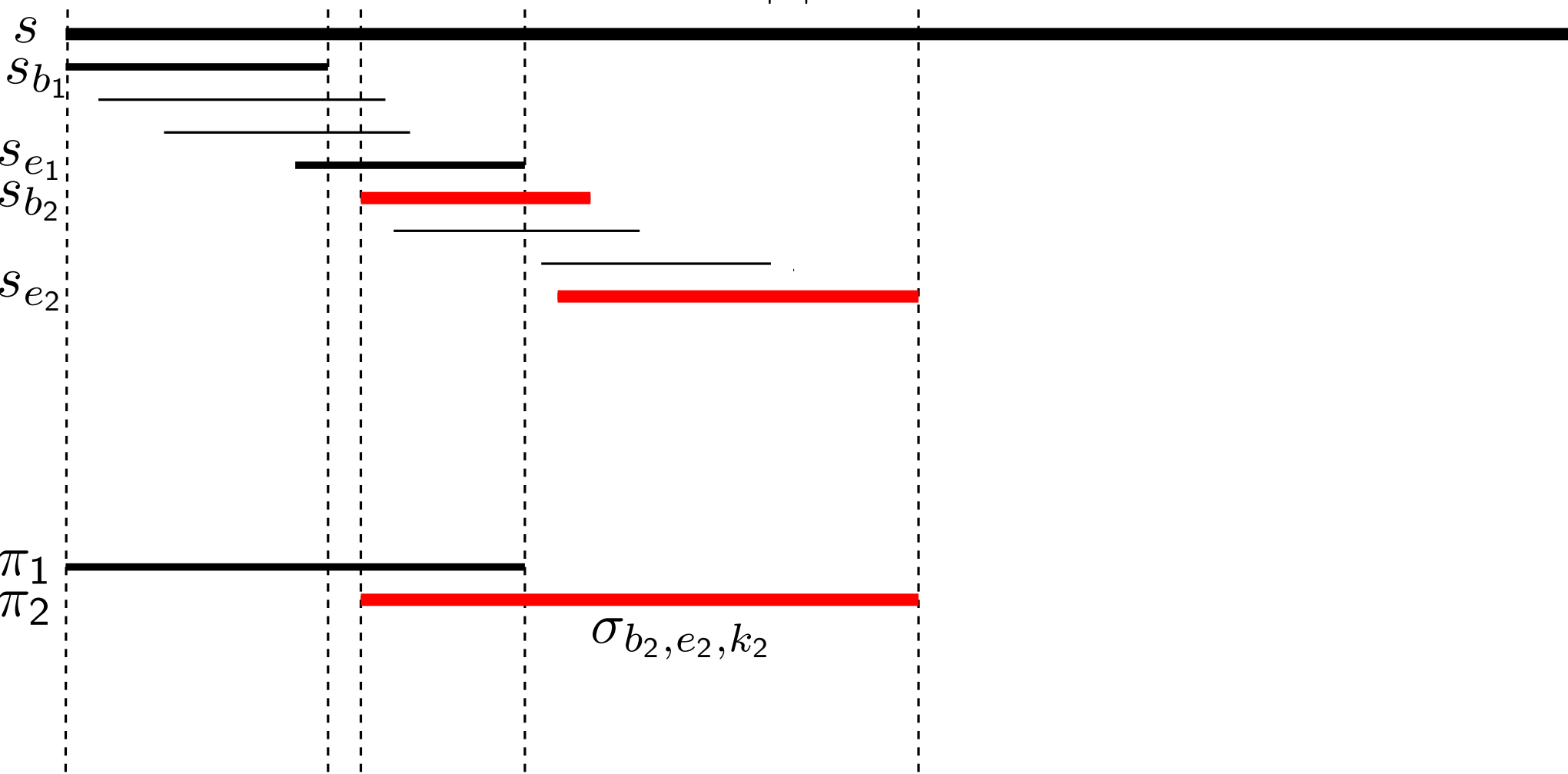
Lemma.

$$\text{OPT}_{\text{SC}} \leq 2 \cdot \text{OPT}$$

Proof.

Let s be an optimal superstring. Construct set cover with:

$$\text{cost} \leq 2|s| = 2 \cdot \text{OPT}.$$



Relating SSS and SETCOVER

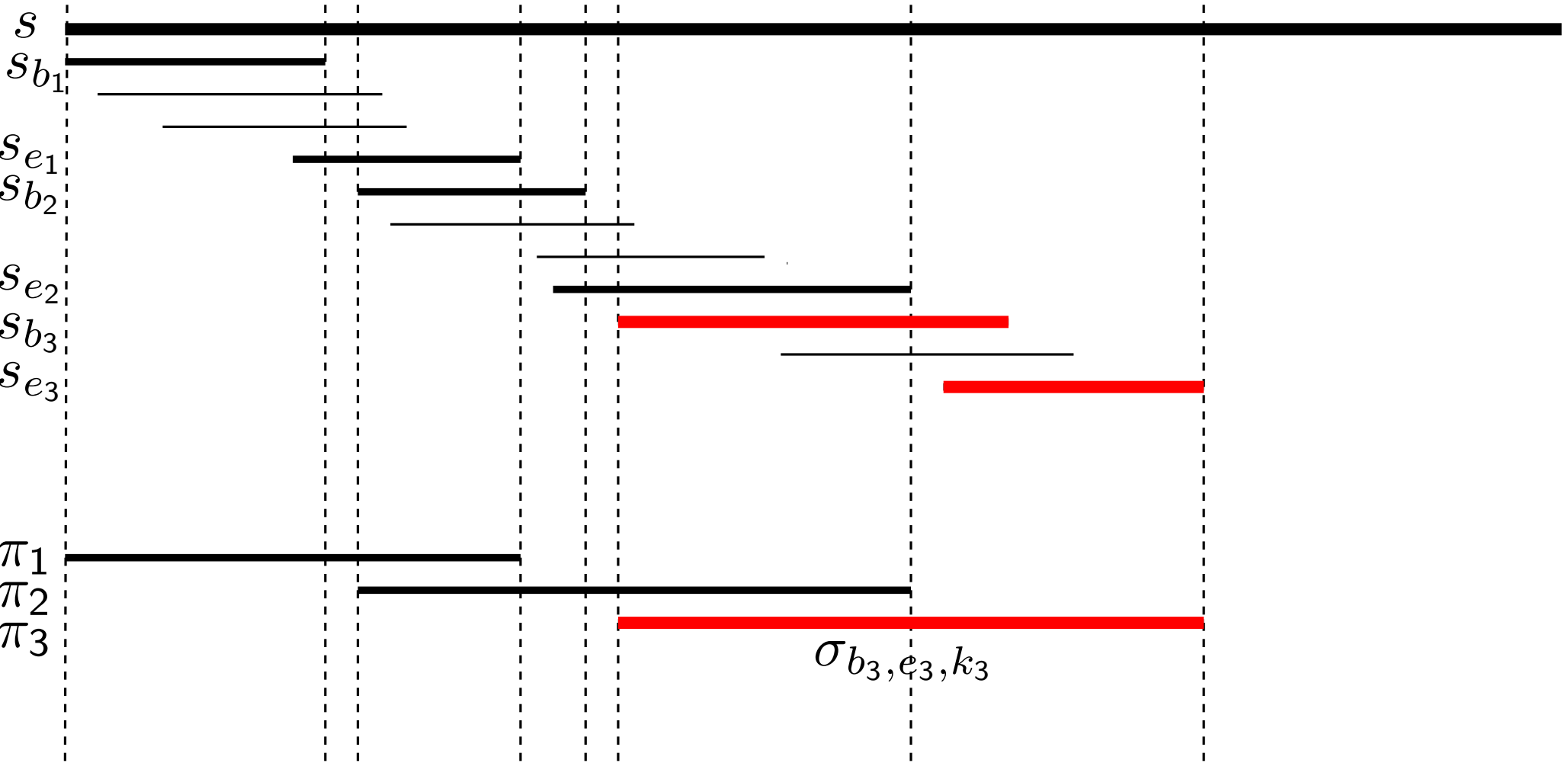
Lemma.

$$\text{OPT}_{\text{SC}} \leq 2 \cdot \text{OPT}$$

Proof.

Let s be an optimal superstring. Construct set cover with:

$$\text{cost} \leq 2|s| = 2 \cdot \text{OPT}.$$



Relating SSS and SETCOVER

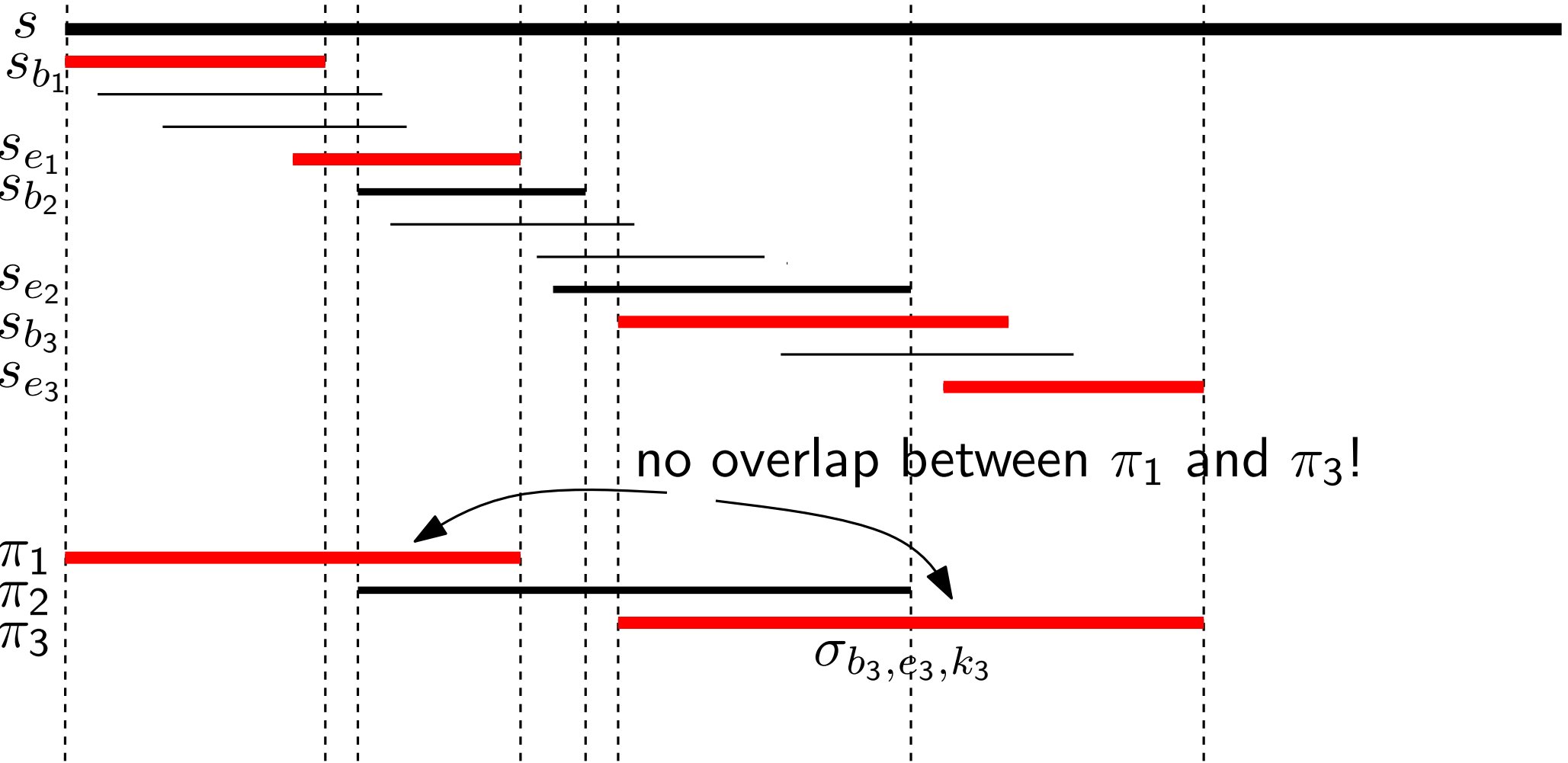
Lemma.

$$\text{OPT}_{\text{SC}} \leq 2 \cdot \text{OPT}$$

Proof.

Let s be an optimal superstring. Construct set cover with:

$$\text{cost} \leq 2|s| = 2 \cdot \text{OPT}.$$



Relating SSS and SETCOVER

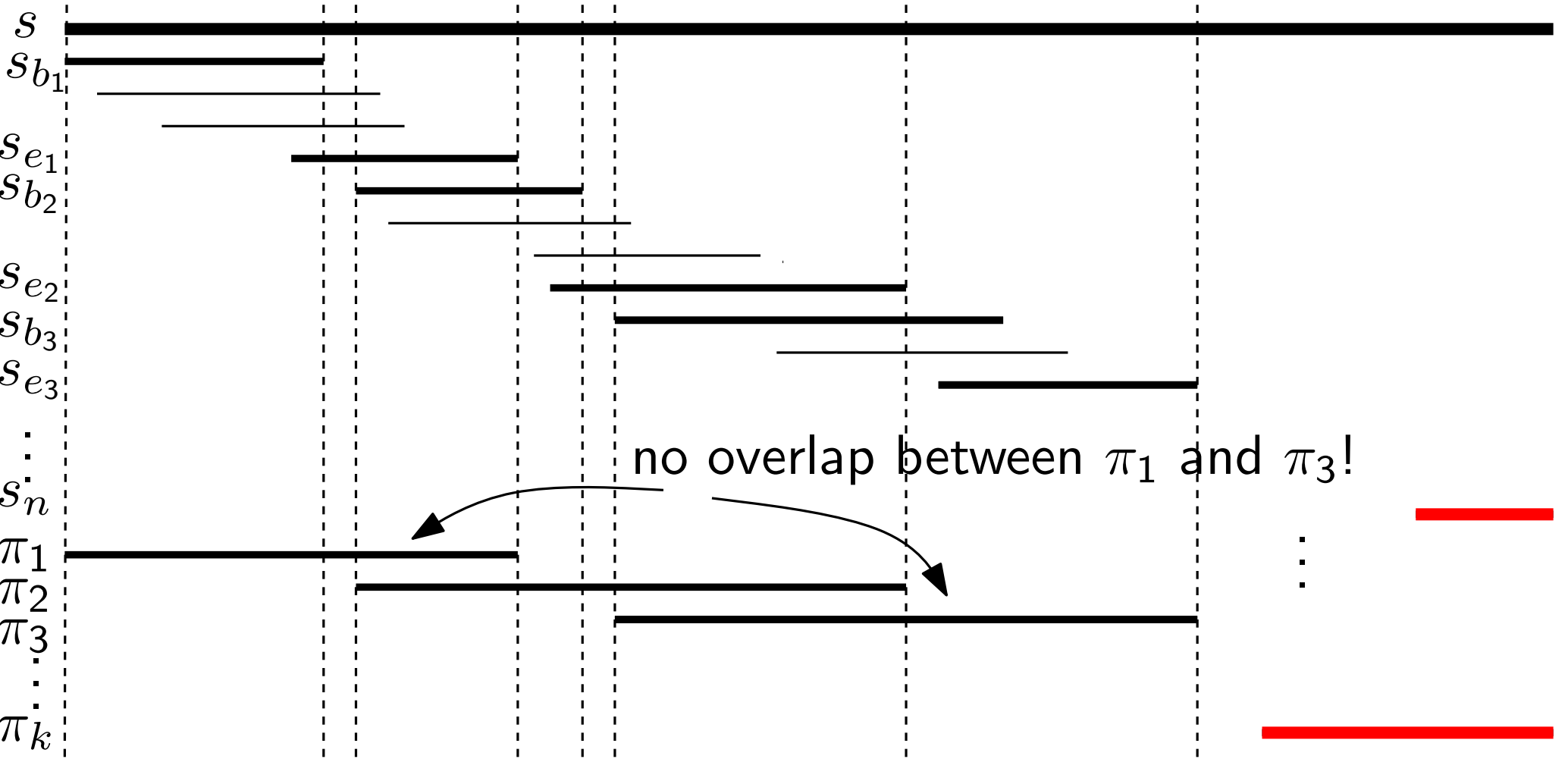
Lemma.

$$\text{OPT}_{\text{SC}} \leq 2 \cdot \text{OPT}$$

Proof.

Let s be an optimal superstring. Construct set cover with:

$$\text{cost} \leq 2|s| = 2 \cdot \text{OPT}.$$



Relating SSS and SETCOVER

Lemma.

$$\text{OPT}_{\text{SC}} \leq 2 \cdot \text{OPT}$$

Proof.

- each string $s_i \in U$ is a substring of some π_j

Relating SSS and SETCOVER

Lemma.

$$\text{OPT}_{\text{SC}} \leq 2 \cdot \text{OPT}$$

Proof.

- each string $s_i \in U$ is a substring of some π_j
- $\text{set}(\pi_1), \dots, \text{set}(\pi_k)$ is a solution for the SETCOVER instance with cost $\sum_i |\pi_i|$

Relating SSS and SETCOVER

Lemma.

$$\text{OPT}_{\text{SC}} \leq 2 \cdot \text{OPT}$$

Proof.

- each string $s_i \in U$ is a substring of some π_j
- $\text{set}(\pi_1), \dots, \text{set}(\pi_k)$ is a solution for the SETCOVER instance with cost $\sum_i |\pi_i|$
- the substrings π_j, π_{j+2} of s do not overlap

Relating SSS and SETCOVER

Lemma.

$$\text{OPT}_{\text{SC}} \leq 2 \cdot \text{OPT}$$

Proof.

- each string $s_i \in U$ is a substring of some π_j
- $\text{set}(\pi_1), \dots, \text{set}(\pi_k)$ is a solution for the SETCOVER instance with cost $\sum_i |\pi_i|$
- the substrings π_j, π_{j+2} of s do not overlap
- each character of s lies in at most two substrings (i.e., π_j and π_{j+1})

Relating SSS and SETCOVER

Lemma.

$$\text{OPT}_{\text{SC}} \leq 2 \cdot \text{OPT}$$

Proof.

- each string $s_i \in U$ is a substring of some π_j
- $\text{set}(\pi_1), \dots, \text{set}(\pi_k)$ is a solution for the SETCOVER instance with cost $\sum_i |\pi_i|$
- the substrings π_j, π_{j+2} of s do not overlap
- each character of s lies in at most two substrings (i.e., π_j and π_{j+1})
- $\sum_i |\pi_i| \leq 2|s| = 2 \cdot \text{OPT}$

Relating SSS and SETCOVER

Lemma.

$$\text{OPT}_{\text{SC}} \leq 2 \cdot \text{OPT}$$

Proof.

- each string $s_i \in U$ is a substring of some π_j
- $\text{set}(\pi_1), \dots, \text{set}(\pi_k)$ is a solution for the SETCOVER instance with cost $\sum_i |\pi_i|$
- the substrings π_j, π_{j+2} of s do not overlap
- each character of s lies in at most two substrings (i.e., π_j and π_{j+1})
- $\sum_i |\pi_i| \leq 2|s| = 2 \cdot \text{OPT}$



Algorithm for SSS

- construct the SETCOVER instance U, \mathcal{S}, c
- Let $\text{set}(\pi_1), \dots, \text{set}(\pi_k)$ be the solution provided by the GreedySetCover algorithm.
- return $\pi_1 \circ \dots \circ \pi_k$ as the superstring.

Algorithm for SSS

- construct the SETCOVER instance U, \mathcal{S}, c
- Let $\text{set}(\pi_1), \dots, \text{set}(\pi_k)$ be the solution provided by the GreedySetCover algorithm.
- return $\pi_1 \circ \dots \circ \pi_k$ as the superstring.

Thm. This algorithm for SHORTESTSUPERSTRING has approximation factor $2\mathcal{H}_n$.

Algorithm for SSS

- construct the SETCOVER instance U, \mathcal{S}, c
- Let $\text{set}(\pi_1), \dots, \text{set}(\pi_k)$ be the solution provided by the GreedySetCover algorithm.
- return $\pi_1 \circ \dots \circ \pi_k$ as the superstring.

Thm. This algorithm for SHORTESTSUPERSTRING has approximation factor $2\mathcal{H}_n$.

Proof.

The cost of the solution is bounded as follows:

$$\mathcal{H}_n \cdot \text{OPT}_{\text{SC}} \leq 2 \cdot \mathcal{H}_n \cdot \text{OPT}$$

Algorithm for SSS

- construct the SETCOVER instance U, \mathcal{S}, c
- Let $\text{set}(\pi_1), \dots, \text{set}(\pi_k)$ be the solution provided by the GreedySetCover algorithm.
- return $\pi_1 \circ \dots \circ \pi_k$ as the superstring.

Thm. This algorithm for SHORTESTSUPERSTRING has approximation factor $2\mathcal{H}_n$.

Proof.

The cost of the solution is bounded as follows:

$$\mathcal{H}_n \cdot \text{OPT}_{\text{SC}} \leq 2 \cdot \mathcal{H}_n \cdot \text{OPT}$$



Algorithm for SSS

- construct the SETCOVER instance U, \mathcal{S}, c
- Let $\text{set}(\pi_1), \dots, \text{set}(\pi_k)$ be the solution provided by the GreedySetCover algorithm.
- return $\pi_1 \circ \dots \circ \pi_k$ as the superstring.

Thm. This algorithm for SHORTESTSUPERSTRING has approximation factor $2\mathcal{H}_n$.

Proof.

The cost of the solution is bounded as follows:

$$\mathcal{H}_n \cdot \text{OPT}_{\text{SC}} \leq 2 \cdot \mathcal{H}_n \cdot \text{OPT}$$

□

Note: SSS has a factor-3 approximation alg. see [V. §7].

Algorithm for SSS

- construct the SETCOVER instance U, \mathcal{S}, c
- Let $\text{set}(\pi_1), \dots, \text{set}(\pi_k)$ be the solution provided by the GreedySetCover algorithm.
- return $\pi_1 \circ \dots \circ \pi_k$ as the superstring.

Thm. This algorithm for SHORTESTSUPERSTRING has approximation factor $2\mathcal{H}_n$.

Proof.

The cost of the solution is bounded as follows:

$$\mathcal{H}_n \cdot \text{OPT}_{\text{SC}} \leq 2 \cdot \mathcal{H}_n \cdot \text{OPT}$$

□

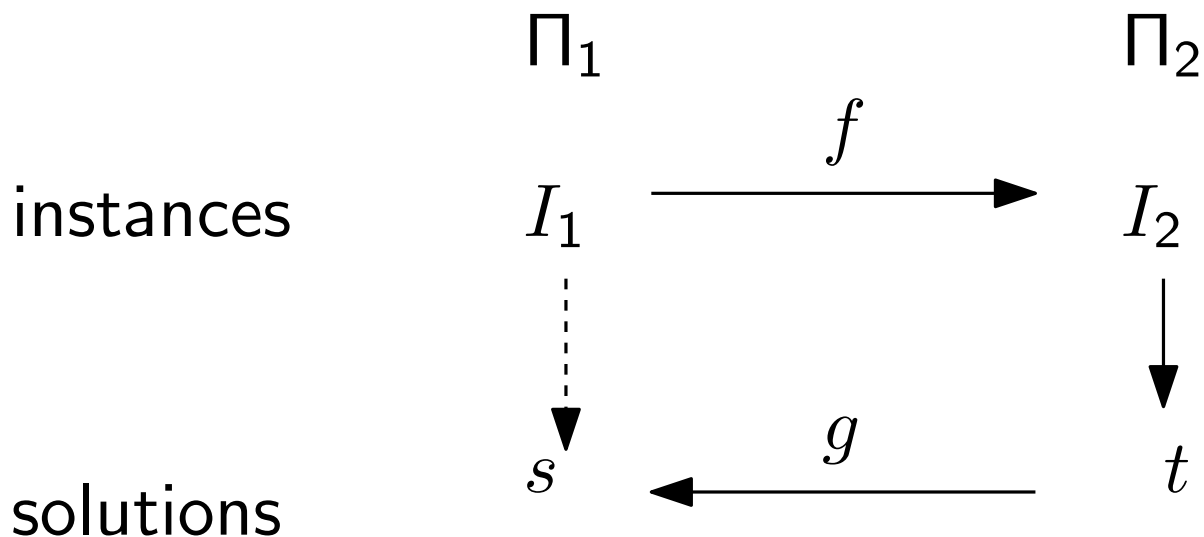
Note: SSS has a factor-3 approximation alg. see [V. §7].

Next Week: Steiner Trees & Multiway-Cuts

Approximation Preserving Reduction

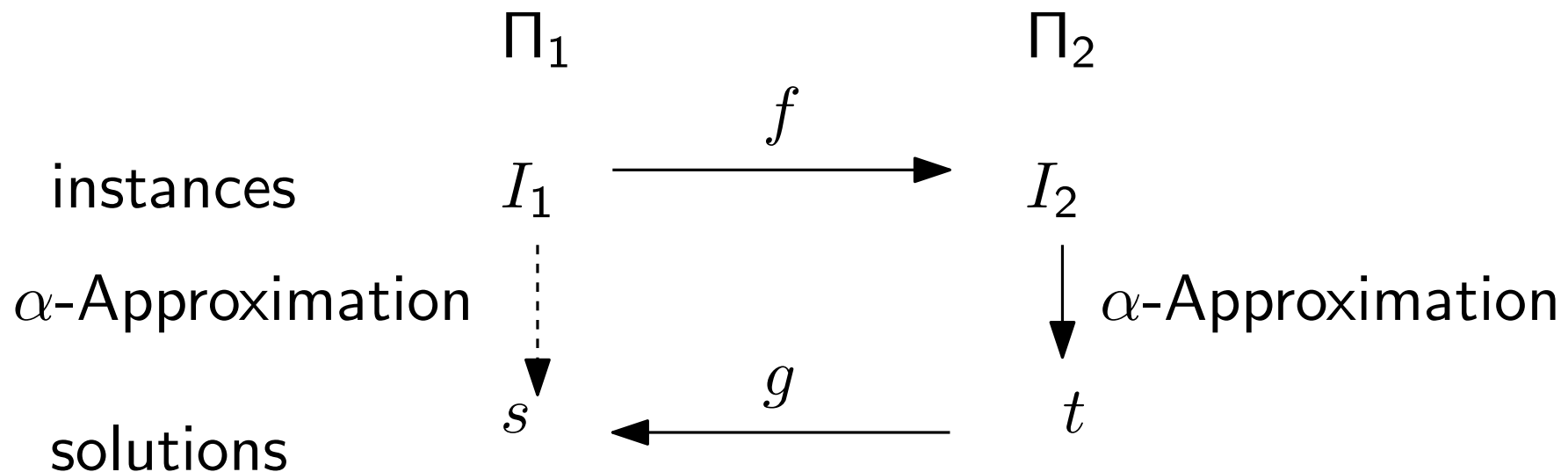
Let Π_1, Π_2 be minimization problems. An **approximation preserving reduction** from Π_1 to Π_2 is a pair (f, g) of poly-time computable functions with the following properties.

- (i) for each instance I_1 of Π_1 , $I_2 := f(I_1)$ is an instance of Π_2 where $\text{OPT}_{\Pi_2}(I_2) \leq \text{OPT}_{\Pi_1}(I_1)$
- (ii) for each feasible solution t of I_2 , $s := g(I_1, t)$ is a feasible solution of I_1 where $\text{obj}_{\Pi_1}(I_1, s) \leq \text{obj}_{\Pi_2}(I_2, t)$



Approximation Preserving Reduction

Thm. Let Π_1, Π_2 be minimization problems where there is an approximation preserving reduction from Π_1 to Π_2 . Then, for each factor- α approximation algorithm of Π_2 , there is a factor- α approximation algorithm of Π_1 .



Approximation Preserving Reduction

Thm. Let Π_1, Π_2 be minimization problems where there is an approximation preserving reduction from Π_1 to Π_2 . Then, for each factor- α approximation algorithm of Π_2 , there is a factor- α approximation algorithm of Π_1 .

Proof.

- Consider a factor- α approx. alg. A of Π_2 and an instance I_1 of Π_1 .
- Let $I_2 := f(I_1)$, $t := A(I_2)$ and $s := g(I_1, t)$
- $\text{obj}_{\Pi_1}(I_1, s) \leq \text{obj}_{\Pi_2}(I_2, t) \leq \alpha \cdot \text{OPT}_{\Pi_2}(I_2) \leq \alpha \cdot \text{OPT}_{\Pi_1}(I_1)$

Approximation Preserving Reduction

Thm. Let Π_1, Π_2 be minimization problems where there is an approximation preserving reduction from Π_1 to Π_2 . Then, for each factor- α approximation algorithm of Π_2 , there is a factor- α approximation algorithm of Π_1 .

Proof.

- Consider a factor- α approx. alg. A of Π_2 and an instance I_1 of Π_1 .
- Let $I_2 := f(I_1)$, $t := A(I_2)$ and $s := g(I_1, t)$
- $\text{obj}_{\Pi_1}(I_1, s) \leq \text{obj}_{\Pi_2}(I_2, t) \leq \alpha \cdot \text{OPT}_{\Pi_2}(I_2) \leq \alpha \cdot \text{OPT}_{\Pi_1}(I_1)$

□

Approximation Preserving Reduction

Thm. Let Π_1, Π_2 be minimization problems where there is an approximation preserving reduction from Π_1 to Π_2 . Then, for each factor- α approximation algorithm of Π_2 , there is a factor- α approximation algorithm of Π_1 .

Proof.

- Consider a factor- α approx. alg. A of Π_2 and an instance I_1 of Π_1 .
- Let $I_2 := f(I_1)$, $t := A(I_2)$ and $s := g(I_1, t)$
- $\text{obj}_{\Pi_1}(I_1, s) \leq \text{obj}_{\Pi_2}(I_2, t) \leq \alpha \cdot \text{OPT}_{\Pi_2}(I_2) \leq \alpha \cdot \text{OPT}_{\Pi_1}(I_1)$

□