

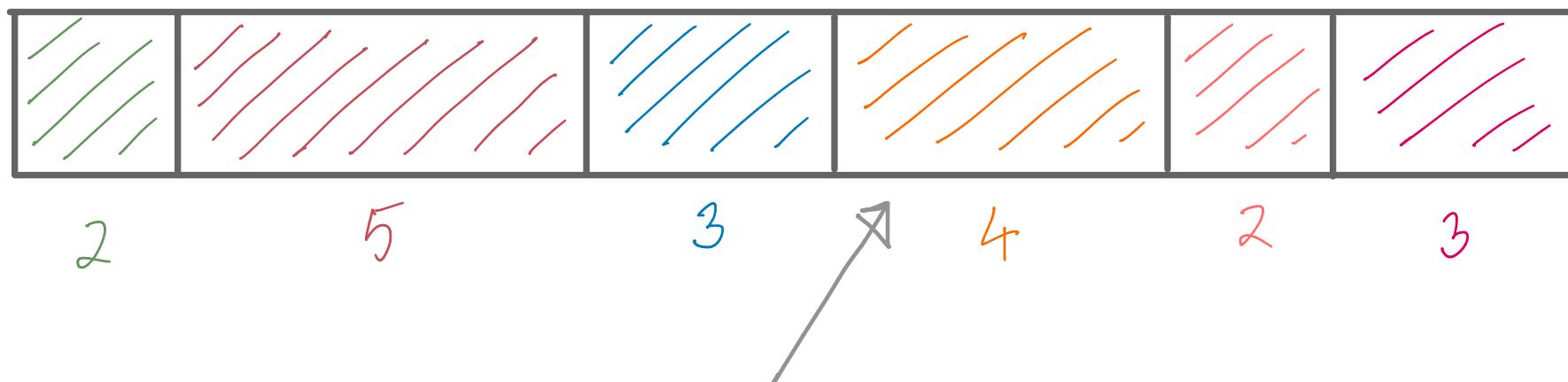
# ADVANCED ALGORITHMS (W1,P1)

## Greedy Algorithms

### Storing files on Tape. I

We have  $n$  files that we want to store on a magnetic tape.

files  $F_1, F_2, \dots, F_n$  of lengths  $L_1, L_2, \dots, L_n$ , respectively.



$$\text{Cost of access} = 2 + 5 + 3 + 4$$

# ADVANCED ALGORITHMS (W1,P1)

## Greedy Algorithms

Storing files on Tape. I

Expected cost of reading a **random** file

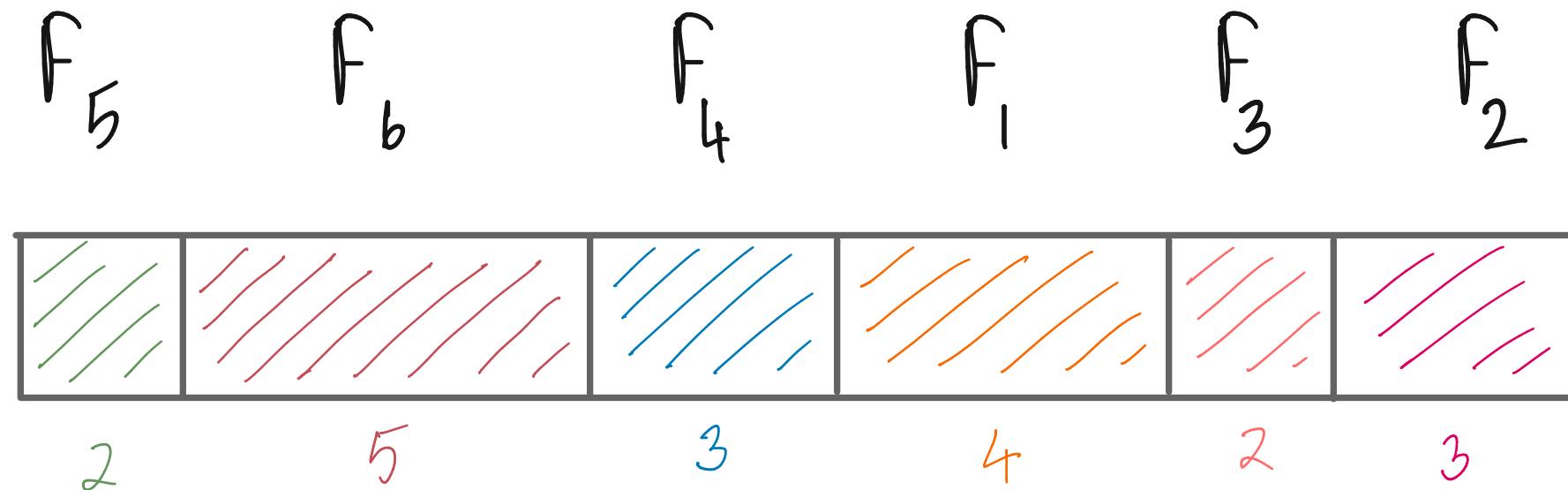
$$E(\text{cost}) = \frac{\sum_{k=1}^n \text{cost}(k)}{n}$$

$$= \frac{1}{n} \sum_{k=1}^n \sum_{i=1}^k l_i$$

# ADVANCED ALGORITHMS (W1,P1)

## Greedy Algorithms

Storing files on Tape. I



$$\begin{aligned}
 & \underline{l_5} + \underline{l_5 + l_6} + \underline{l_5 + l_6 + l_4} + \underline{l_5 + l_6 + l_4 + l_1} \\
 & + \underline{l_5 + l_6 + l_4 + l_1 + l_3} + \underline{l_5 + l_6 + l_4 + l_1 + l_3 + l_2}
 \end{aligned}$$

# ADVANCED ALGORITHMS (W1,P1)

## Greedy Algorithms

Storing files on Tape. I

When files are sorted according to  $\pi$ :

Expected cost of reading a random file

$$E(\text{cost}) = \sum_{k=1}^n \frac{\text{cost}(k)}{n}$$

\*  $\pi(i)$  denotes the index of the  $i^{th}$  file from the left

stored on the tape

$$= \frac{1}{n} \sum_{k=1}^n \sum_{i=1}^k L_{\pi(i)}$$

# ADVANCED ALGORITHMS (W1,P1)

## Greedy Algorithms

Storing files on Tape. I

Question

Which order **minimizes** the expected cost ?

A strategy that "feels" natural :

Store the files in increasing order of length

# ADVANCED ALGORITHMS (W1,P1)

## Greedy Algorithms

### Storing files on Tape. I

Lemma.  $E(\text{cost})$  is minimized when  $L_{\pi(i+1)} \geq L_{\pi(i)} \ \forall i$ .

Suppose  $\pi$  is optimal &  $\exists i \text{ s.t. } L_{\pi(i+1)} < L_{\pi(i)}$ .

for the sake of contradiction

Modify  $\pi$  by swapping  $i, i+1$ .

~~Before~~

$$\text{cost}(\pi(i)) \\ l_{\pi(1)} + \dots + l_{\pi(i)}$$

$$l_{\pi(1)} + \dots + l_{\pi(i)} + l_{\pi(i+1)}$$

$$\text{cost}(\pi(i+1))$$

~~After~~

$$\text{cost}(\pi(i+1))$$

$$l_{\pi(1)} + \dots + l_{\pi(i+1)}$$

$$l_{\pi(1)} + \dots + l_{\pi(i+1)} + l_{\pi(i)}$$

$$\text{cost}(\pi(i))$$

# ADVANCED ALGORITHMS (W1, P2)

## Greedy Algorithms

### Storing files on Tape. I

Suppose now that we are also given information  
 about the frequencies      with which these files are accessed.

$F_i$  will be accessed  $f_i$  times.

$$\begin{aligned} \text{Total cost} &= \sum_{k=1}^n f_{\pi(k)} \cdot \left\{ \sum_{i=1}^k l_{\pi(i)} \right\} = \sum_{k=1}^n \sum_{i=1}^k f_{\pi(k)} \cdot l_{\pi(i)} \\ &\quad \uparrow \\ &\quad \text{cost of } \pi(k) \end{aligned}$$

Storing files on Tape. I

## Question

Which order **minimizes** the total cost ?

If all file lengths are equal : sort by ↓ frequencies

← more frequent → less frequent

If all frequencies are equal : sort by ↑ file lengths

← smaller files → larger files

# ADVANCED ALGORITHMS (W1, P2)

## Greedy Algorithms

Storing files on Tape. I

In general, sort by the ratio

higher values have priority

$f/l$

lower values have priority

Lemma. Total cost ( $\pi$ ) is minimized when

$$\frac{l_{\pi(i)}}{f_{\pi(i)}} \leq \frac{l_{\pi(i+1)}}{f_{\pi(i+1)}} \quad \text{for all } i$$

# ADVANCED ALGORITHMS (W1, P2)

## Greedy Algorithms

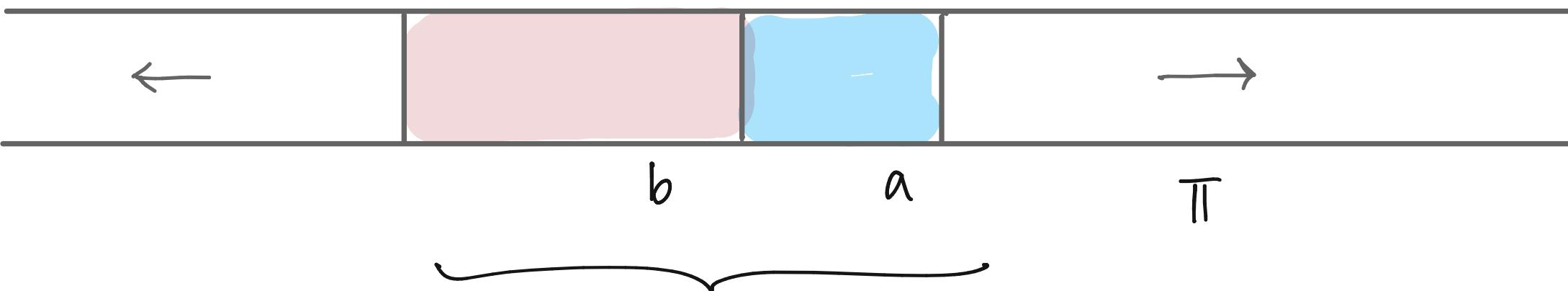
Storing files on Tape. I

$$\pi(i) = a \quad \pi(i+1) = b$$

Proof.



Suppose  $\pi$  is optimal &  $\frac{l_a}{f_a} > \frac{l_b}{f_b}$



Swap these files

# ADVANCED ALGORITHMS (W1, P2)

## Greedy Algorithms

Storing files on Tape. II

$$\text{cost}(\pi) = \dots + f_a l_a + \dots + f_b l_a + f_b l_b + \dots$$

$$\text{cost}(\pi') = \dots + f_b l_b + \dots + f_a l_b + f_a l_a + \dots$$

$$\text{net change} = f_a l_b - f_b l_a$$

Recall that :  $\frac{l_a}{f_a} > \frac{l_b}{f_b} \Rightarrow f_b l_a > f_a l_b$

$$\Rightarrow f_a l_b - f_b l_a < 0,$$

by assumption

a net reduction in cost !

# ADVANCED ALGORITHMS (W1,P3)

## Greedy Algorithms

Scheduling Classes.

The Setting

$n$  classes in a semester



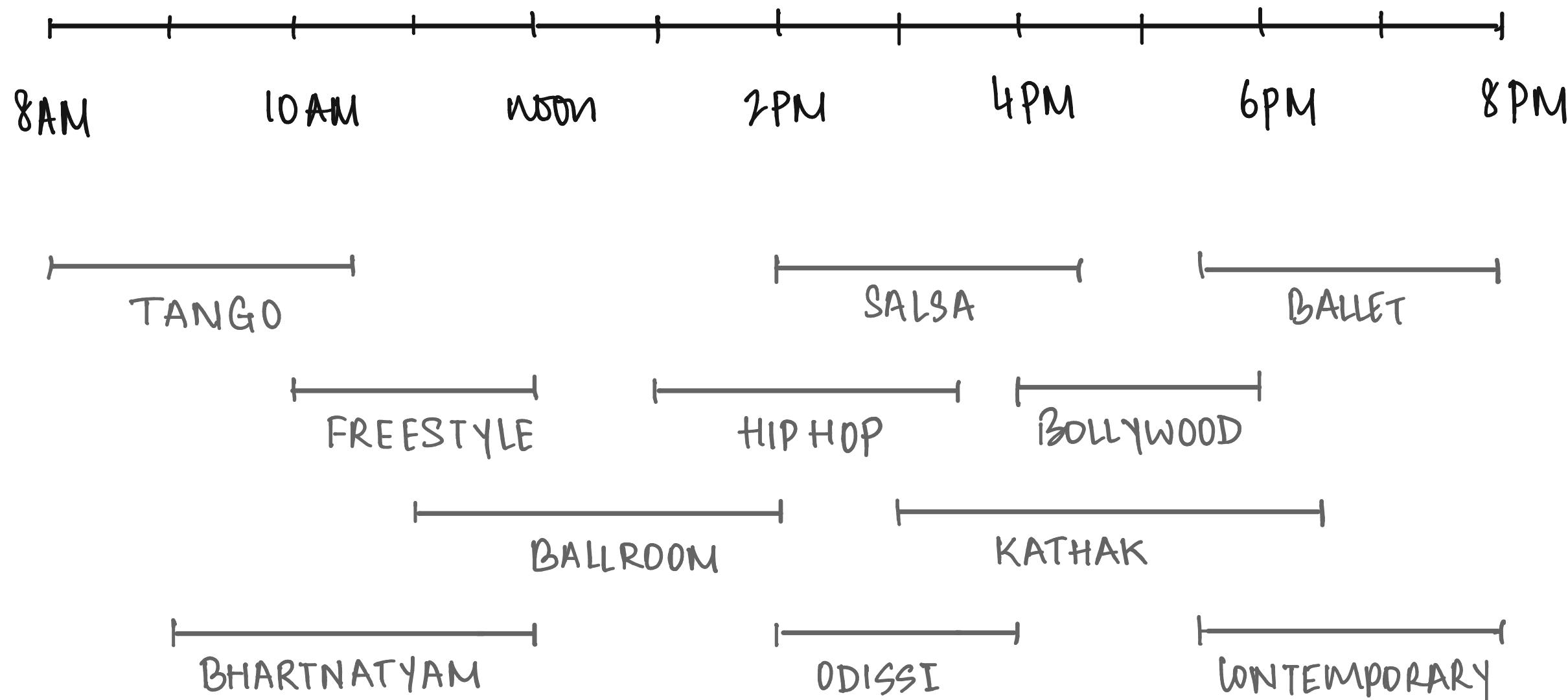
( Start time, finish time )  
 $s_p$        $f_p$

(Also, all classes happen on Saturdays)

# ADVANCED ALGORITHMS (W1,P3)

## Greedy Algorithms

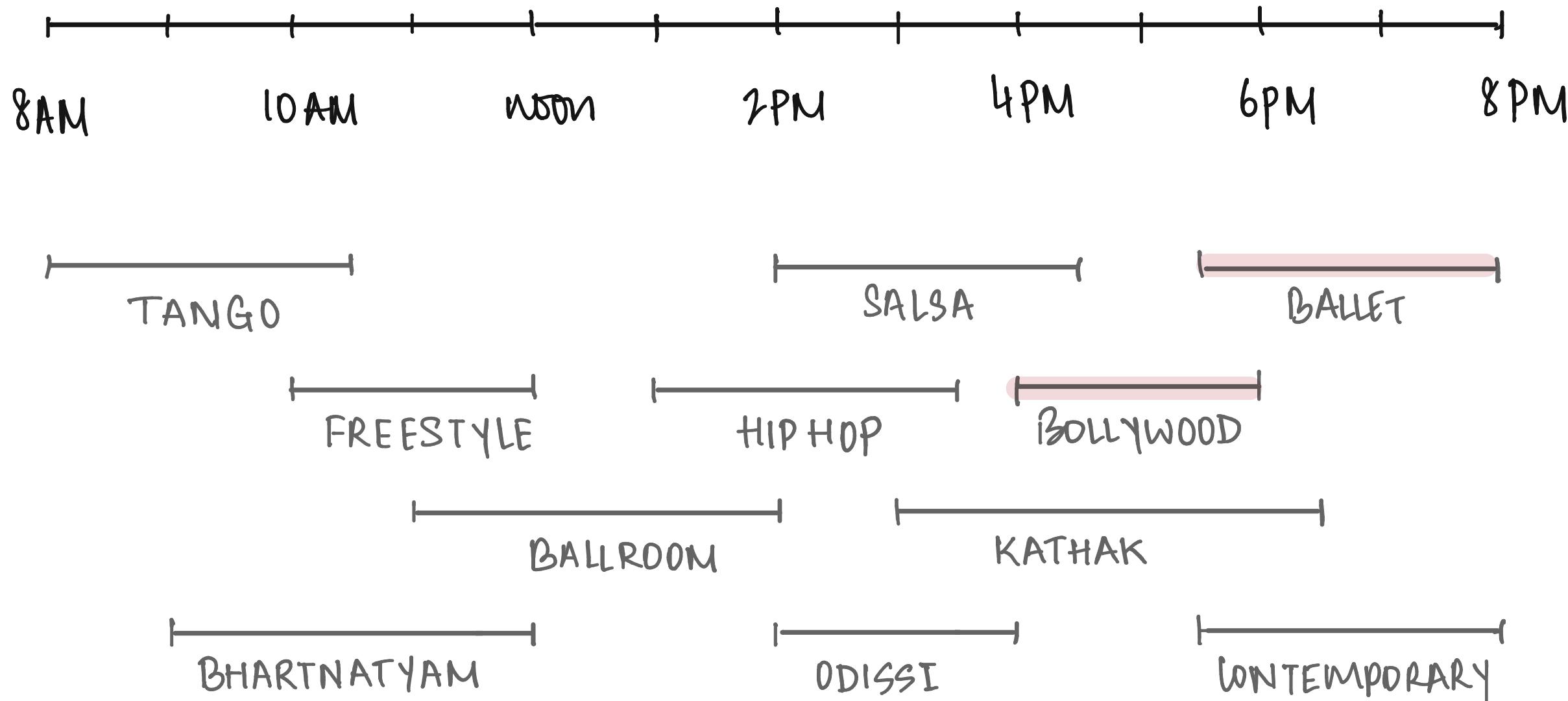
Scheduling Classes.



# ADVANCED ALGORITHMS (W1,P3)

## Greedy Algorithms

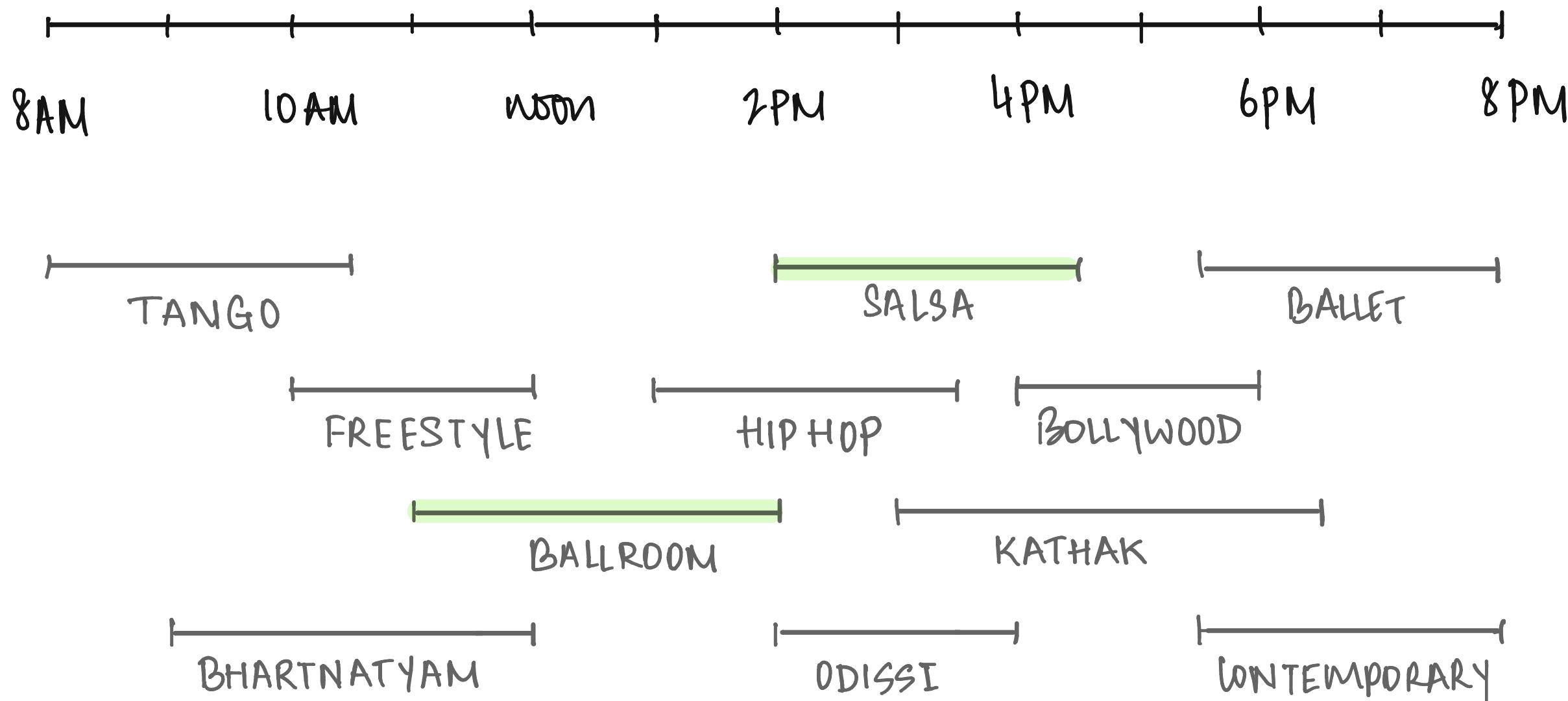
Scheduling Classes.



# ADVANCED ALGORITHMS (W1,P3)

## Greedy Algorithms

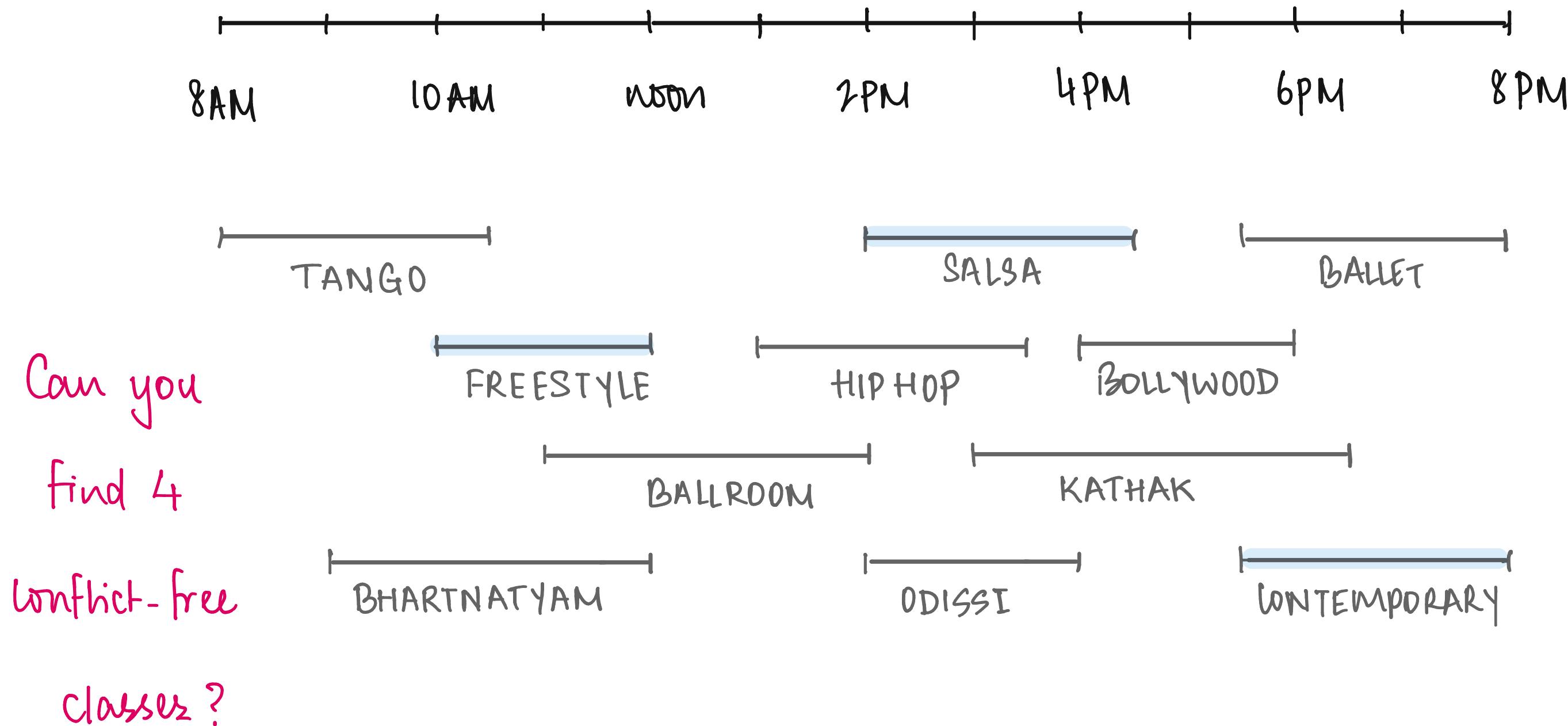
Scheduling Classes.



# ADVANCED ALGORITHMS (W1,P3)

## Greedy Algorithms

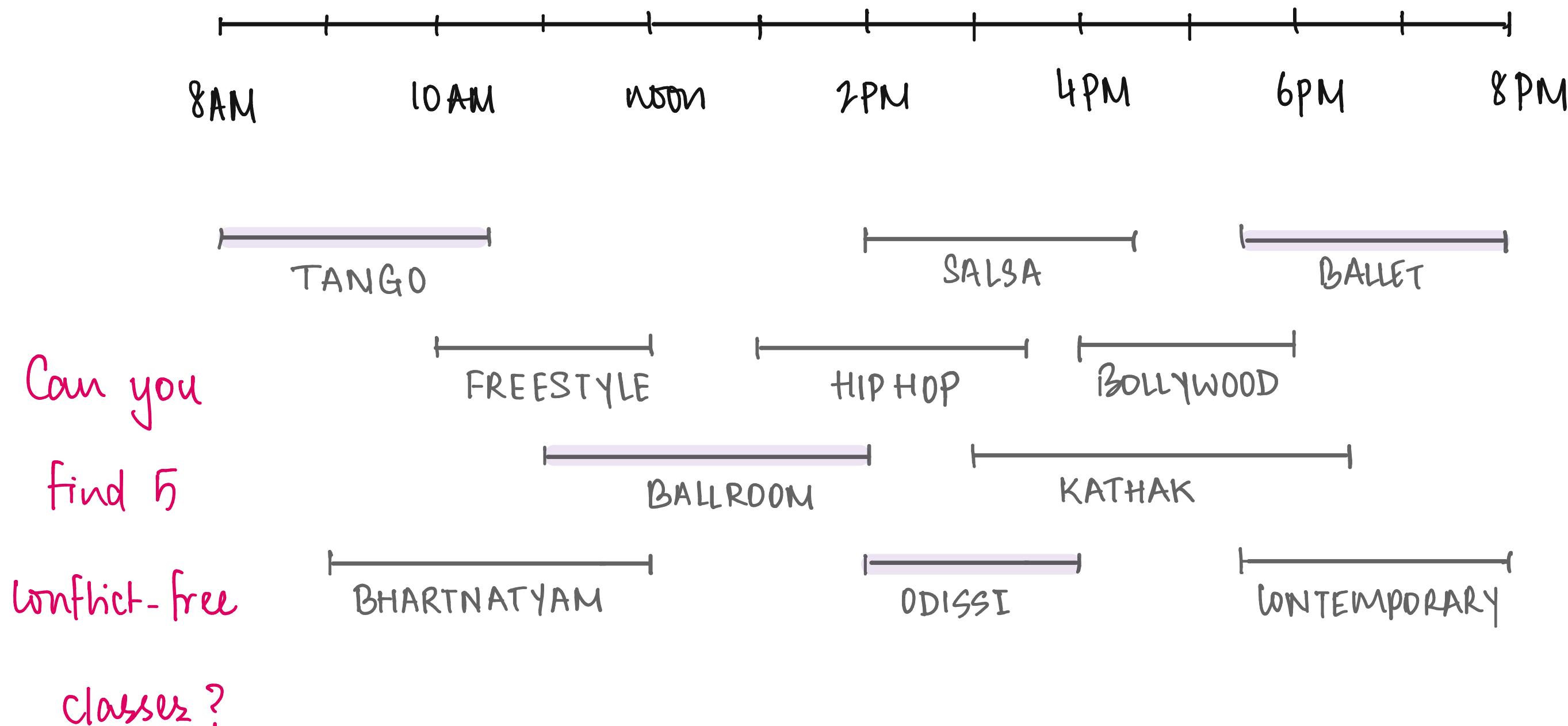
Scheduling Classes.



# ADVANCED ALGORITHMS (W1,P3)

## Greedy Algorithms

Scheduling Classes.



# ADVANCED ALGORITHMS (W1,P3)

Scheduling Classes.

The Goal

find a largest conflict-free

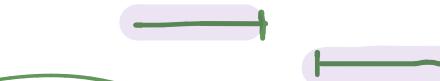
collection of classes.

$$\{ \dots, p, q, \dots \}$$

## Greedy Algorithms

$$s_p \geq f_q \text{ or } f_p \leq s_q$$

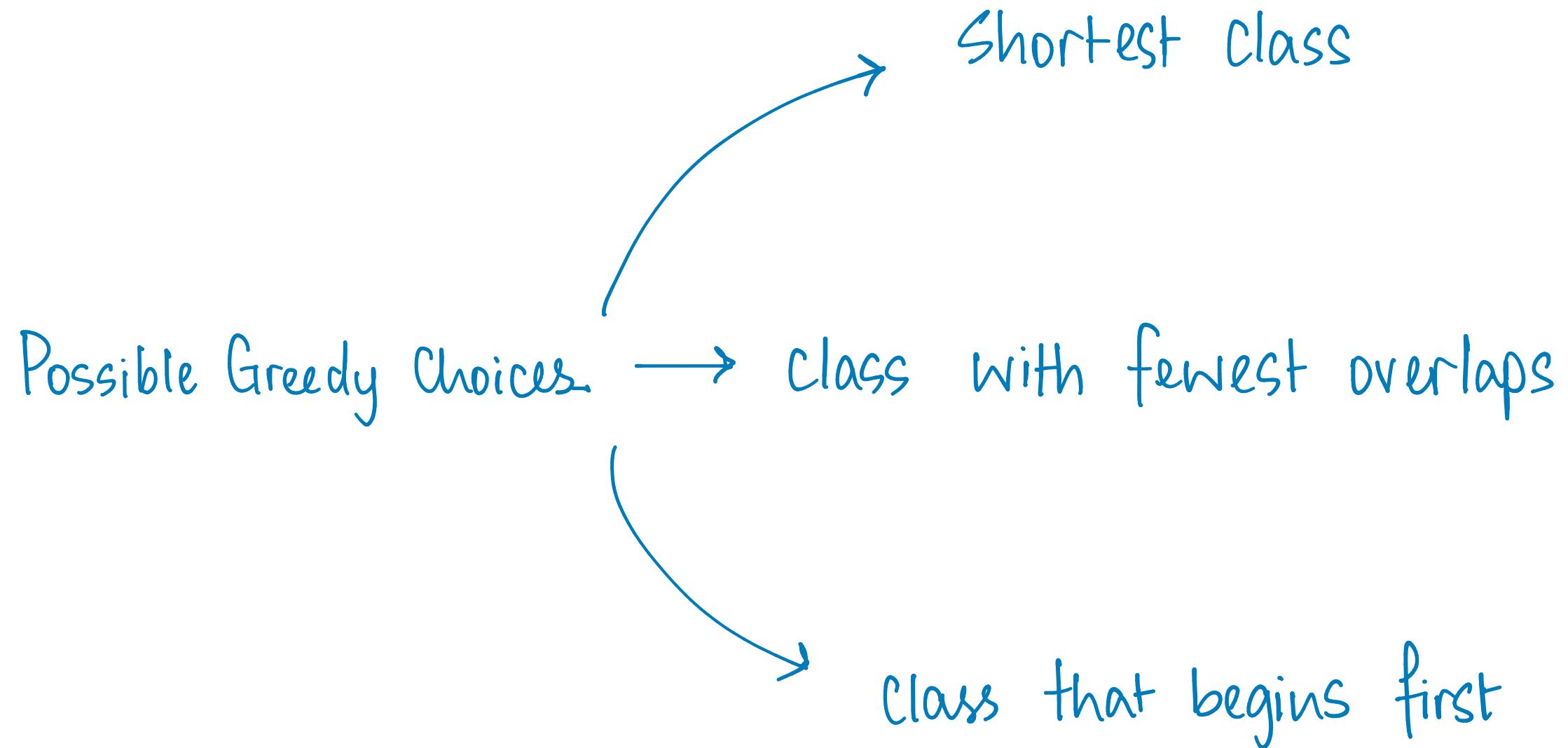
$$f_{p,q}$$



# ADVANCED ALGORITHMS (W1,P3)

## Greedy Algorithms

Scheduling Classes.



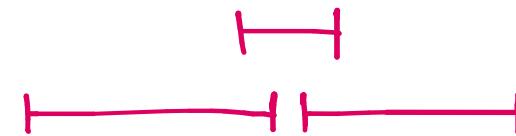
# ADVANCED ALGORITHMS (W1,P3)

## Greedy Algorithms

Scheduling Classes.

Possible Greedy Choices. → class with fewest overlaps

Shortest class



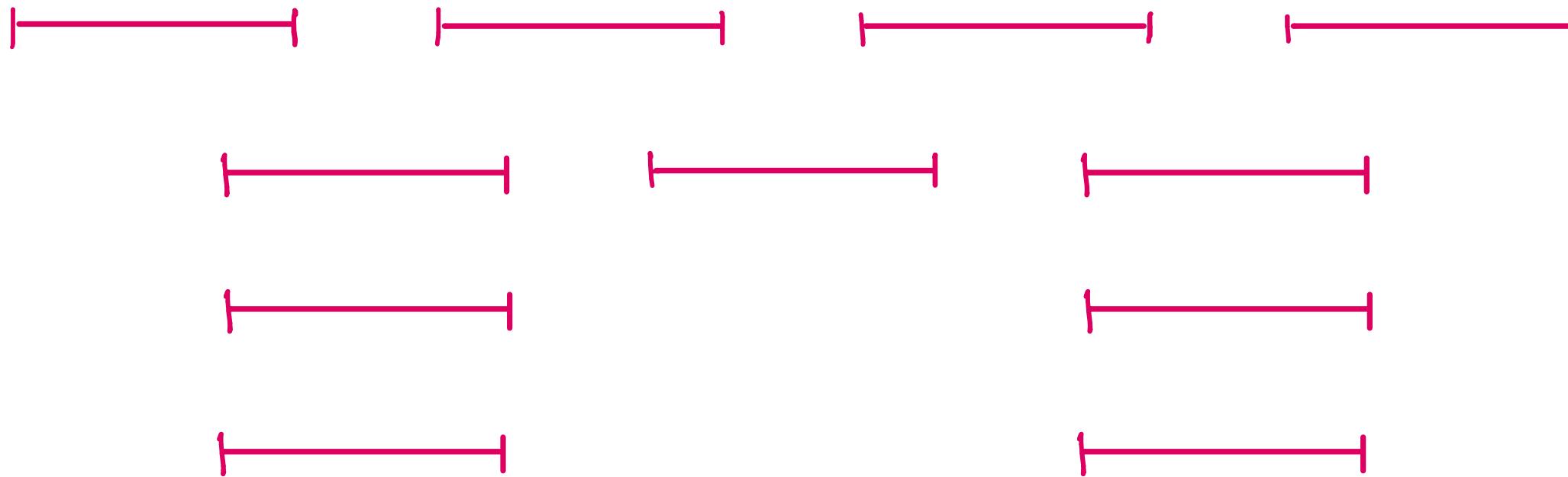
Class that begins first



# ADVANCED ALGORITHMS (W1,P3)

## Greedy Algorithms

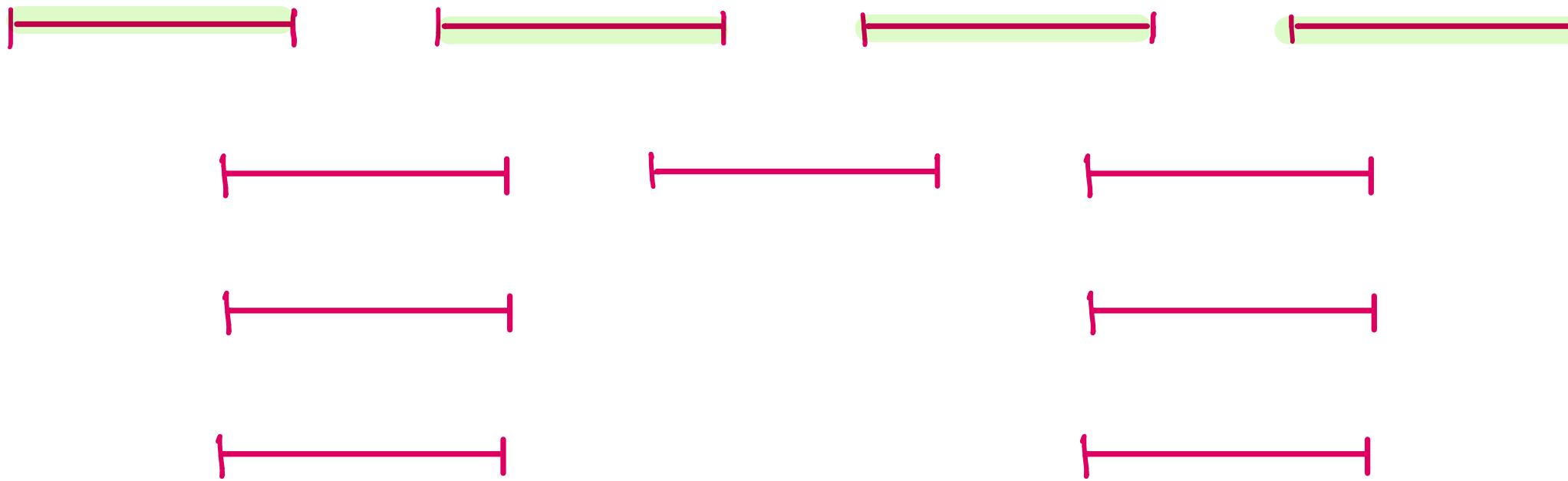
Scheduling Classes.



# ADVANCED ALGORITHMS (W1,P3)

## Greedy Algorithms

Scheduling Classes.

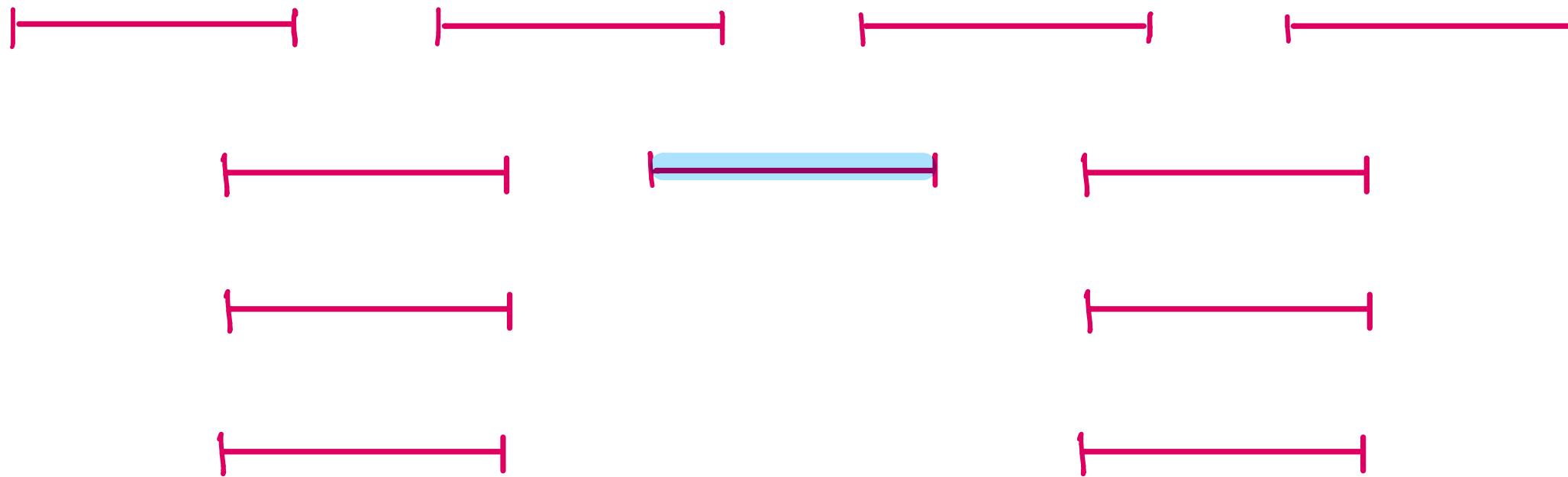


$$Opt = 4$$

# ADVANCED ALGORITHMS (W1,P3)

## Greedy Algorithms

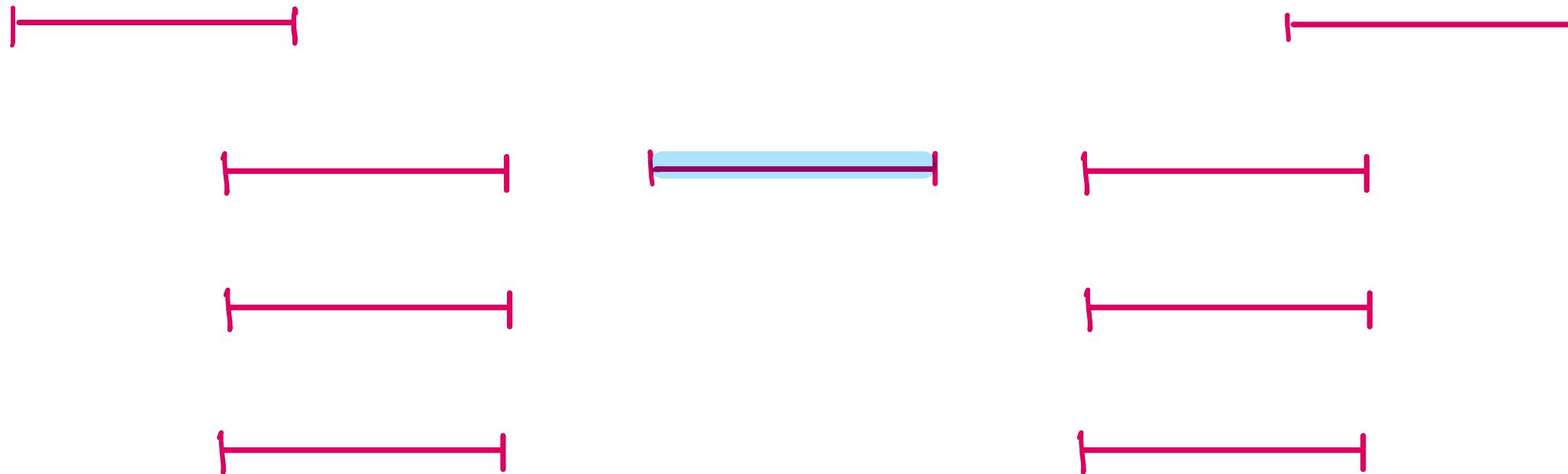
Scheduling Classes.



# ADVANCED ALGORITHMS (W1,P3)

## Greedy Algorithms

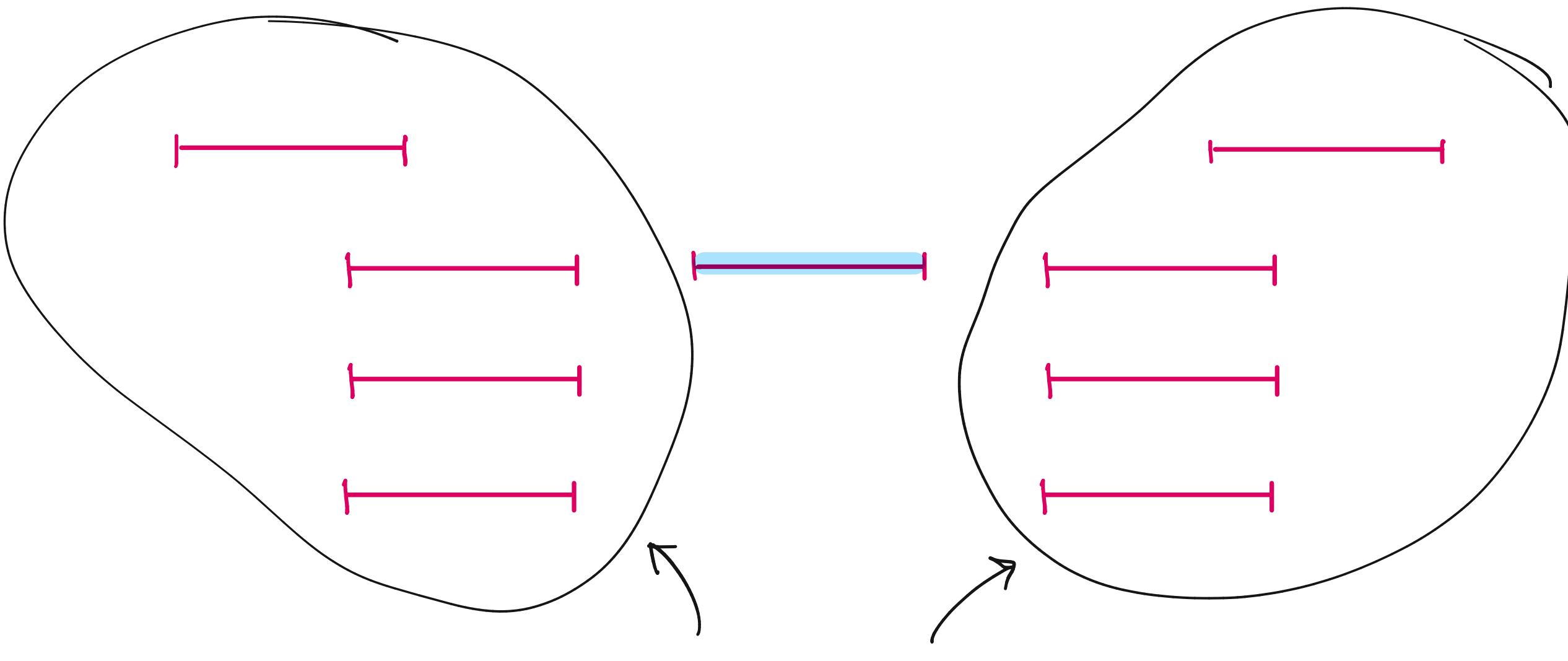
Scheduling Classes.



# ADVANCED ALGORITHMS (W1,P3)

## Greedy Algorithms

Scheduling Classes.



Pick 1

Greedy = 3

# ADVANCED ALGORITHMS (W1,P3)

## Greedy Algorithms

Scheduling Classes.

Takeaway  
+

Intuitively appealing greedy strategies  
may not actually work!

# ADVANCED ALGORITHMS (W1,P3)

## Greedy Algorithms

Scheduling Classes.

The Greedy Approach

that does work :

Pick the class that ends first.

Scheduling Classes . II

Greedy Scheduler

Sort classes by finish time.

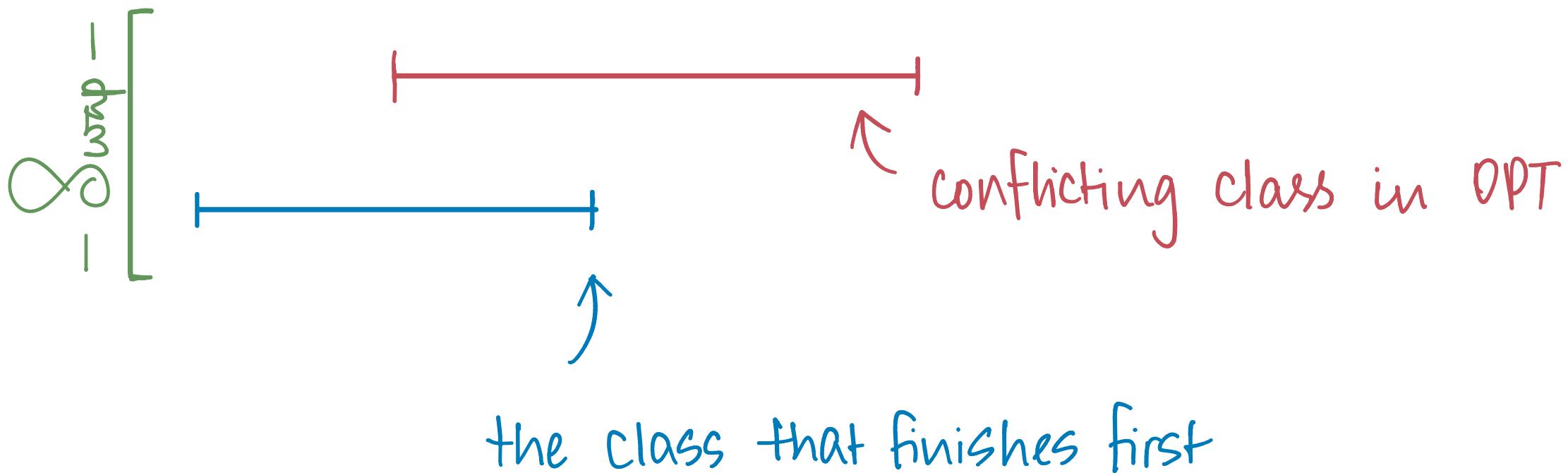
Count = 0,  $X = \emptyset$

while a class is still available :

add the first class to  $X$  & remove it  
remove all classes that conflict with  $C$ .

Scheduling Classes II

Lemma. At least one optimal conflict-free collection of classes includes the one that finishes first



Scheduling Classes . II

Theorem. The greedy schedule is optimal

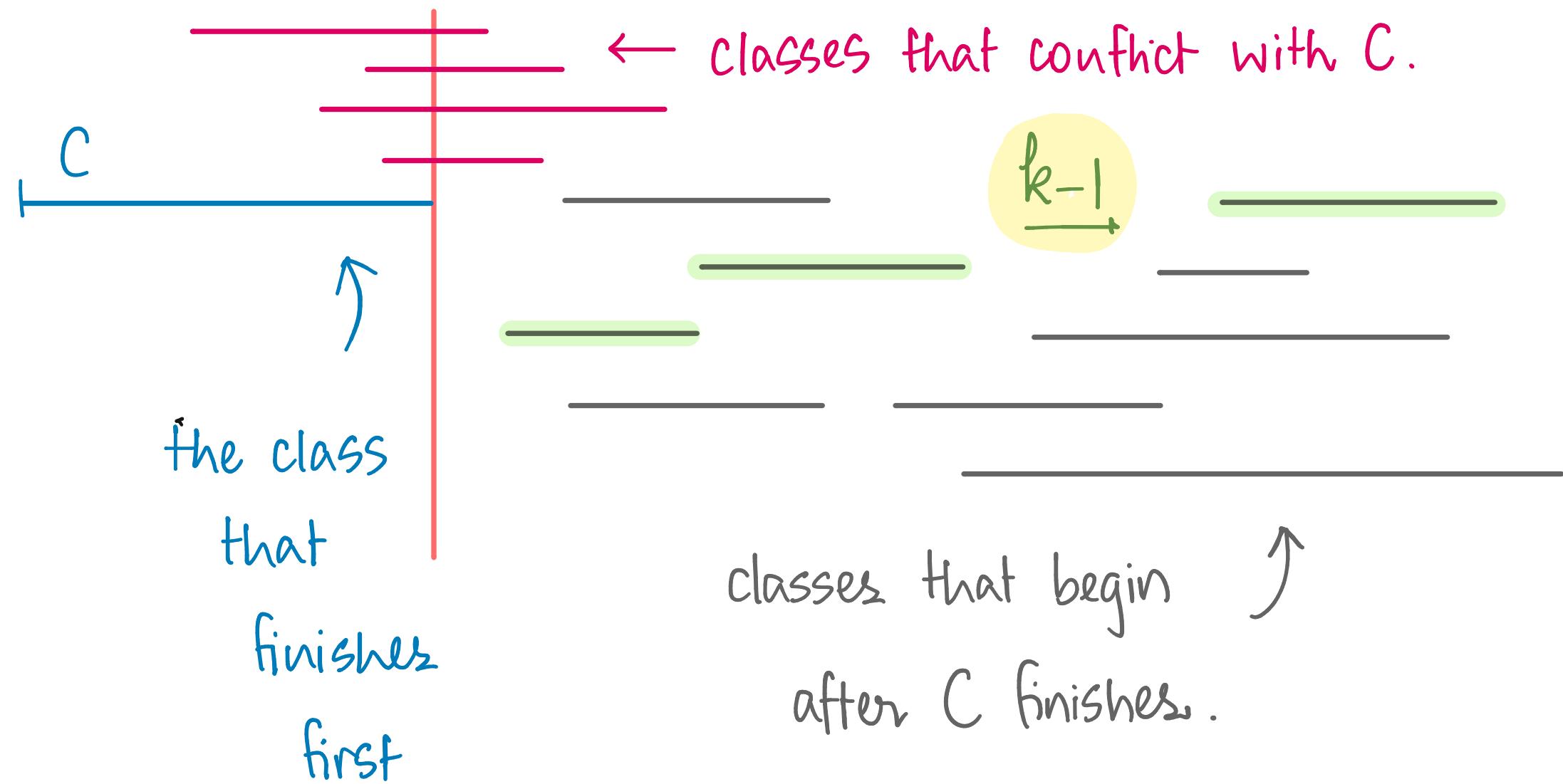
Recall:

$\exists$  an optimal

Schedule that

contains  $C$ .

$\Rightarrow k$  classes

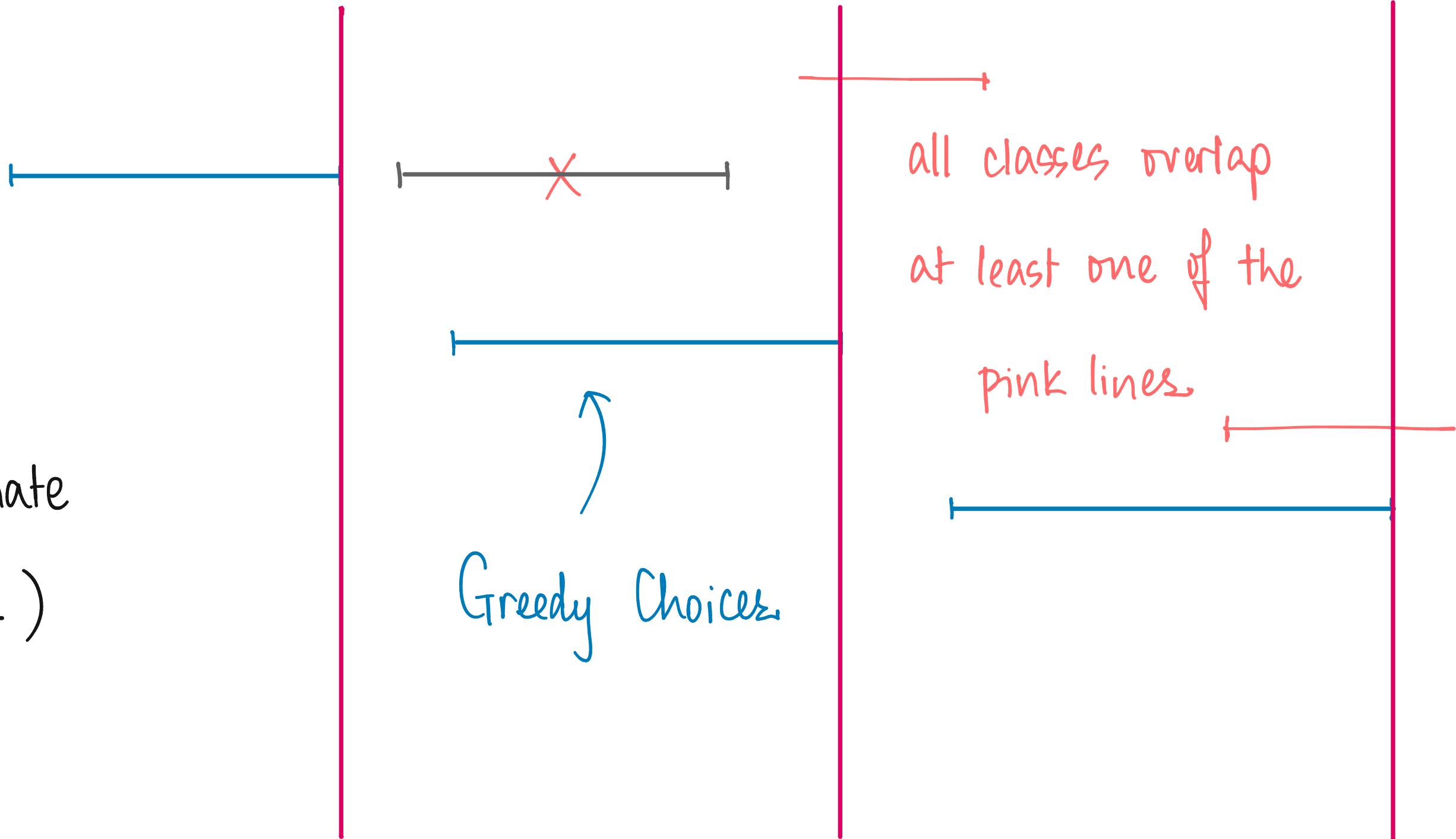


# ADVANCED ALGORITHMS (W1, P4)

## Greedy Algorithms

### Scheduling Classes . II

( An alternate  
proof. )



## Stable Matchings I

Two groups of "agents"

→ doctors, hospitals

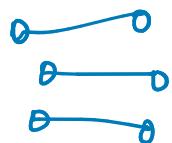
→ Students, Colleges

→ jobs, applicants

→ men, women

who have **preferences** over each other  
*rankings*

need to be matched with each other.



How?

# ADVANCED ALGORITHMS (W1, P5)

## Greedy Algorithms

### Stable Matchings I

Web Developer  
@ Amazing

SEO Strategist  
@ Giggle

Raj > Lata



unstable pair

AKA blocking pair

Stable Matchings Ii/p  $\rightarrow$  n men & n women.

all men rank all the women &amp;

vice-versa.

GOAL. find a matching that  
minimizes the # of blocking pairs.

A matching w no blocking pairs

is called a STABLE MATCHING.

Stable Matchings I

Idea Start with any matching.

While  $\exists$  a blocking pair :

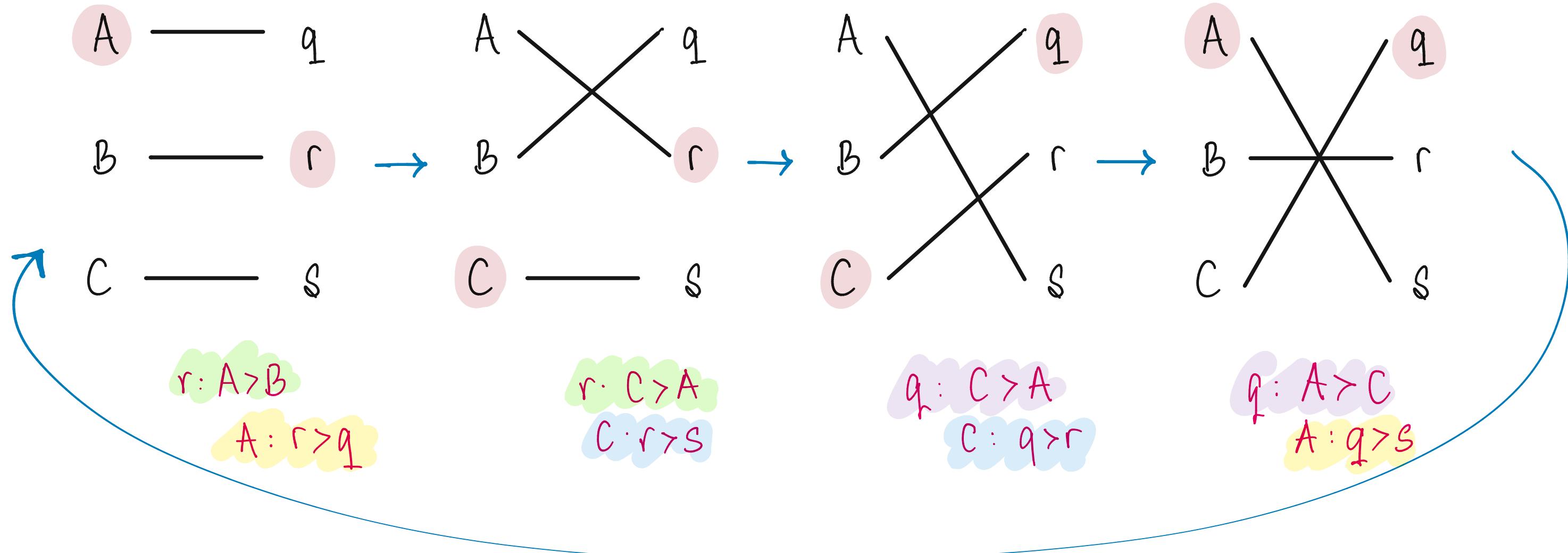
rematch in their favor

to  $\downarrow$  # of blocking pairs by 1

& hopefully (?) not create new ones.

Stable Matchings I

This greed is never-ending!



Stable Matchings II

Another greedy approach (that works)

- men propose in rank order
- & women engage with the best offer.

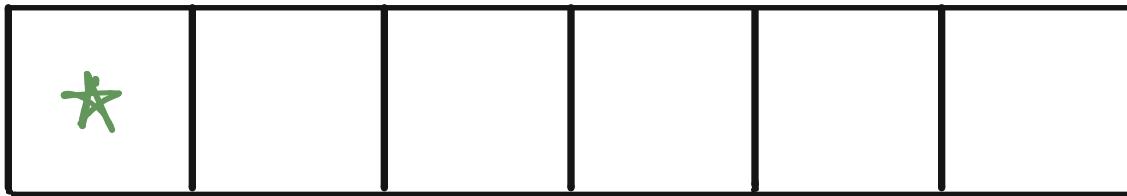
# ADVANCED ALGORITHMS (W1, P6)

## Greedy Algorithms

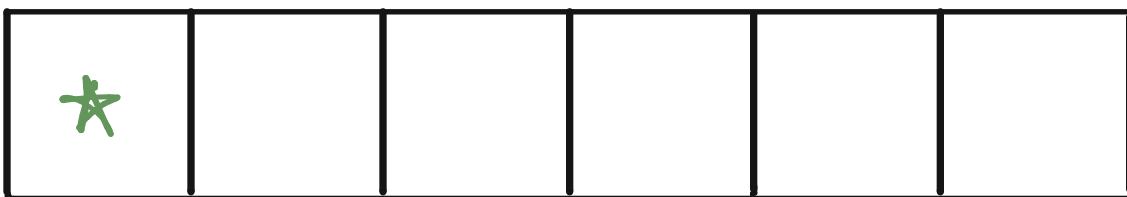
### Stable Matchings II

Men's  
perspective :

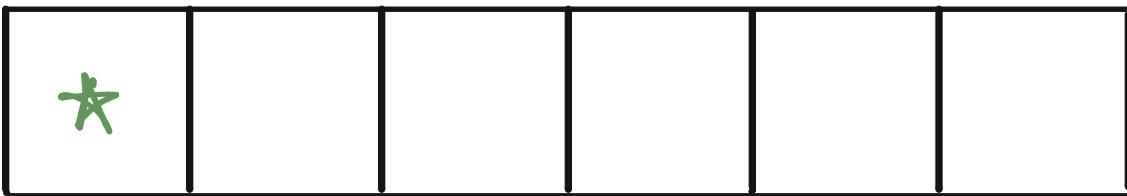
$m_n$



$m_2$



$m_1$



all "Single"

men

"propose"

to the

highest - ranked

woman who

has not rejected

them yet.

Stable Matchings II

$w_i \rightsquigarrow$  no proposals  $\rightarrow$  nothing to do

$w_i \rightsquigarrow$  multiple proposals  $\rightarrow$  engage w/  
at least 1  
the best\*

\* even if it means  
breaking off an existing  
engagement.

from  $w_i$ 's  
perspective

# ADVANCED ALGORITHMS (W1, P6)

## Greedy Algorithms

### Stable Matchings II



$m_k \rightsquigarrow w_i \longleftrightarrow m_j \rightsquigarrow$  goes back  
to being  
single

if  $w_i$  does not accept  $m_k$ 's proposal,

$(w_i, m_k)$  will be a blocking pair



will match with someone "worse" than  $w_i$

# ADVANCED ALGORITHMS (W1, P6)

## Greedy Algorithms

### Stable Matchings II

q      C > B > A

A      q > s > r

r      A > C > B

B      q > r > s

s      A > B > C

C      s > r > q

# ADVANCED ALGORITHMS (W1, P6)

## Greedy Algorithms

### Stable Matchings II

A, B

q

C > B > A

A  $\rightarrow$  q > s > r

r

A > C > B

B  $\rightarrow$  q > r > s

c

s

A > B > C

C  $\rightarrow$  s > r > q

# ADVANCED ALGORITHMS (W1, P6)

## Greedy Algorithms

### Stable Matchings II

q      C > B > A

r      A > C > B

s      A > B > C

A      s > r

B      q > r > s

C      s > r > q

qb, sc

# ADVANCED ALGORITHMS (W1, P6)

## Greedy Algorithms

### Stable Matchings II

q      C > B > A

A → S > r

r      A > C > B

B      q > r > s

A      S      A > B > C

C      S > r > q

qb, sc

# ADVANCED ALGORITHMS (W1, P6)

## Greedy Algorithms

### Stable Matchings II

q      C > B > A

r      A > C > B

s      A > B > C

A      S > r

B      q > r > s

C      r > q

qb, ~~sc~~, sa

# ADVANCED ALGORITHMS (W1, P6)

## Greedy Algorithms

### Stable Matchings II

q      C > B > A

A      S > r

c r      A > C > B

B q > r > s

s A > B > C

C → r > q

qb, sc, sa

# ADVANCED ALGORITHMS (W1, P6)

## Greedy Algorithms

### Stable Matchings II

$q \quad C > \textcolor{lightgreen}{B} > A$

$r \quad A > \textcolor{lightgreen}{C} > B$

$s \quad \textcolor{lightgreen}{A} > B > C$

$A \quad \textcolor{lightgreen}{S} > r$

$B \quad q > r > s$

$C \quad r > q$

$qb, \cancel{sc}, sa, rc$

Stable Matchings III

Correctness of  
Deferred Acceptance

terminates

in a Stable

matching

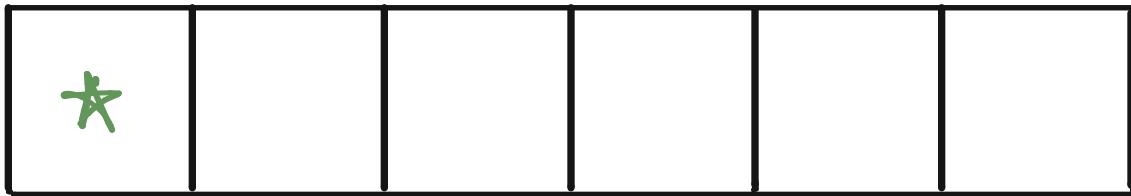
# ADVANCED ALGORITHMS (W1, P7)

## Greedy Algorithms

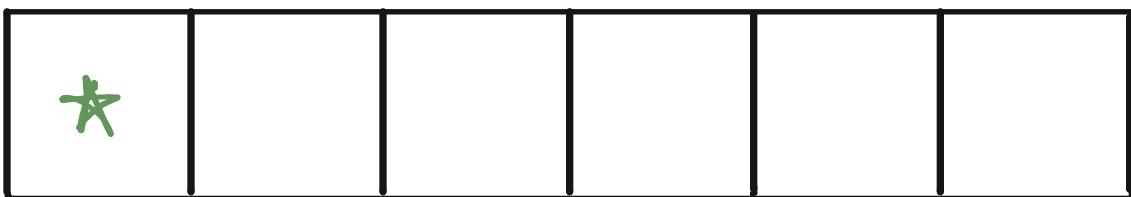
### Stable Matchings III

Men's  
perspective :

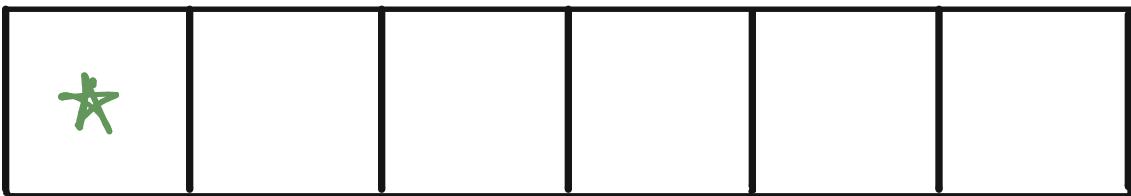
$m_n$



$m_2$



$m_1$



all "Single"

men

"propose"

to the

highest - ranked

woman who

has not rejected

them yet.

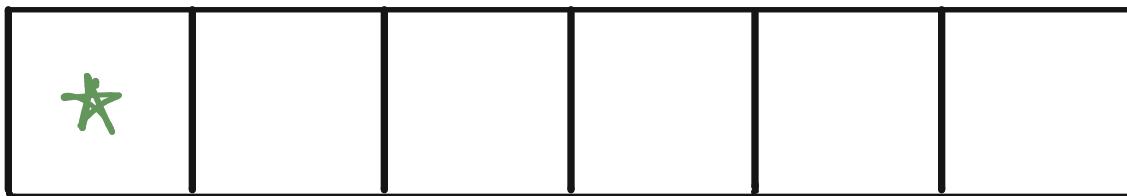
# ADVANCED ALGORITHMS (W1, P7)

## Greedy Algorithms

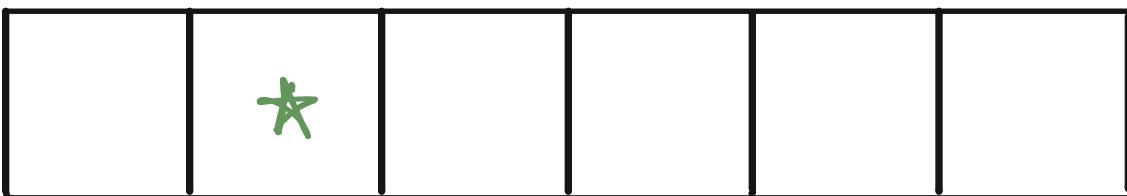
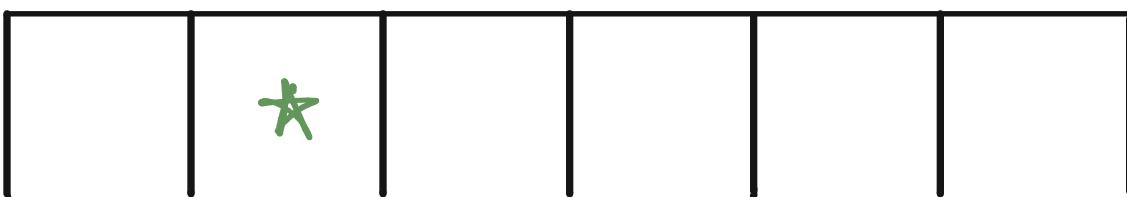
### Stable Matchings III

Men's  
perspective :

$m_n$



$m_2$



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"propose"

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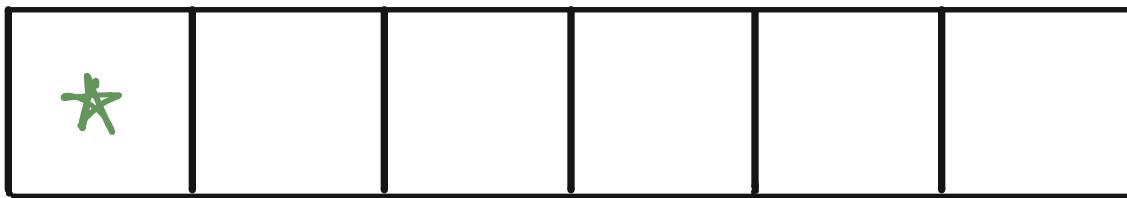
# ADVANCED ALGORITHMS (W1, P7)

## Greedy Algorithms

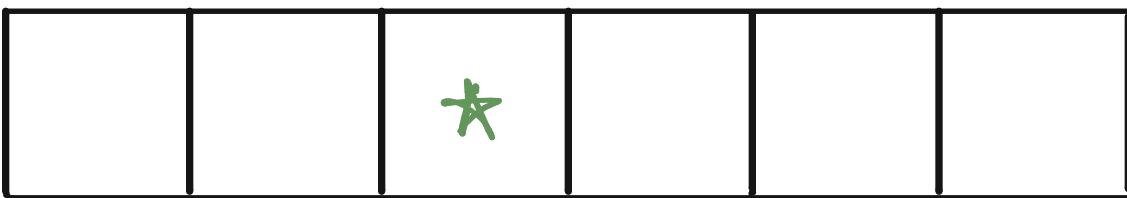
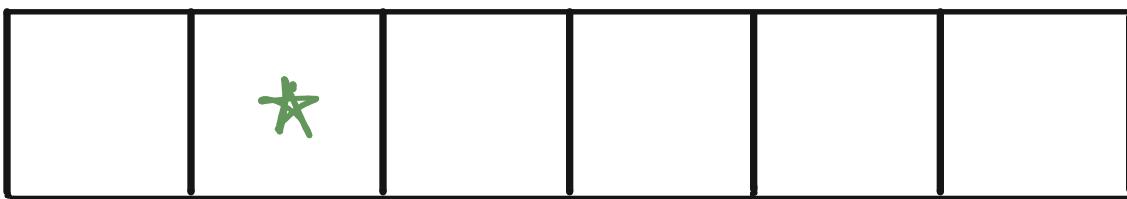
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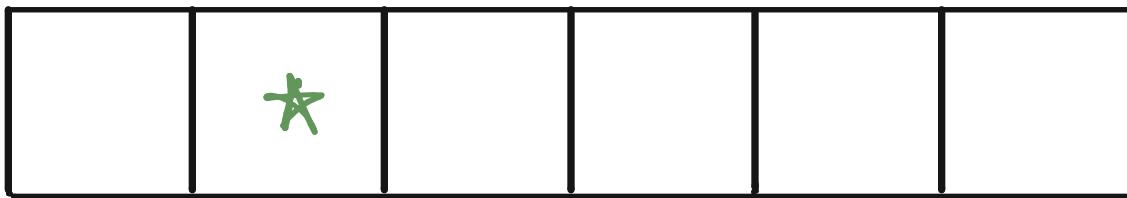
# ADVANCED ALGORITHMS (W1, P7)

## Greedy Algorithms

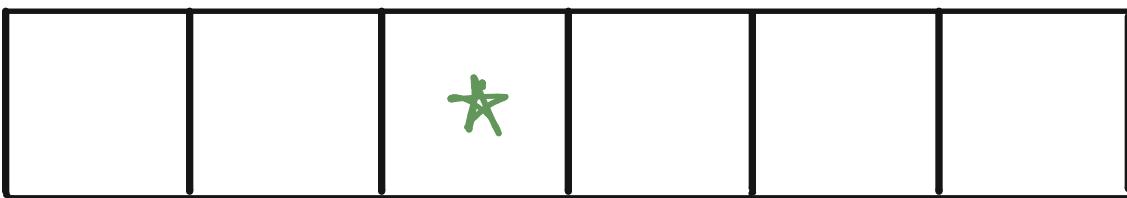
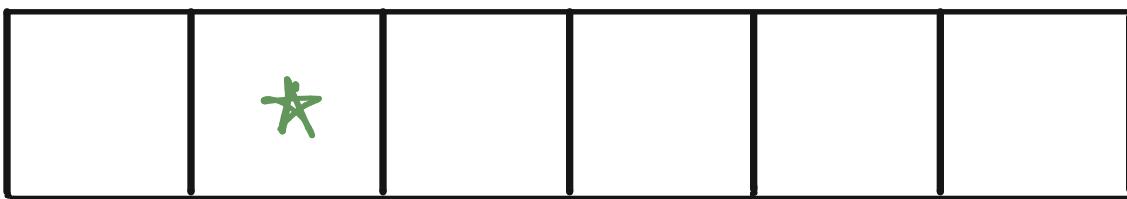
### Stable Matchings III

Men's  
perspective :

$m_n$



$m_2$



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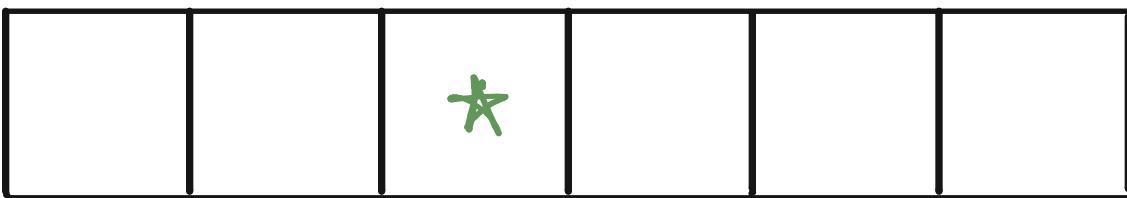
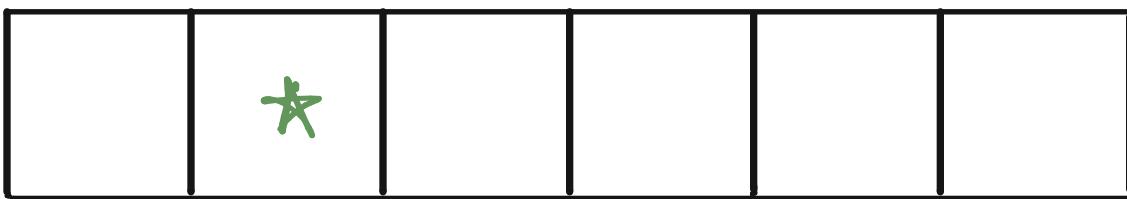
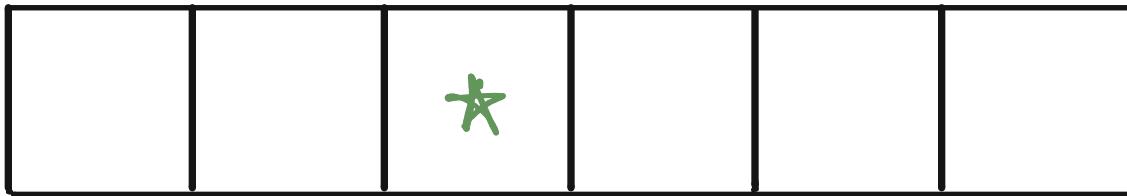
# ADVANCED ALGORITHMS (W1, P7)

## Greedy Algorithms

### Stable Matchings III

Men's  
perspective :

$m_n$



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men

"propose"

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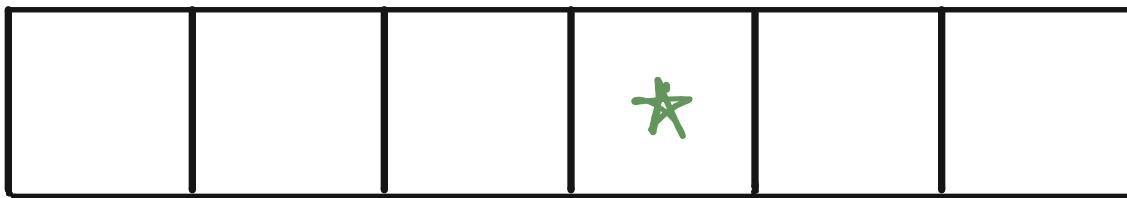
# ADVANCED ALGORITHMS (W1, P7)

## Greedy Algorithms

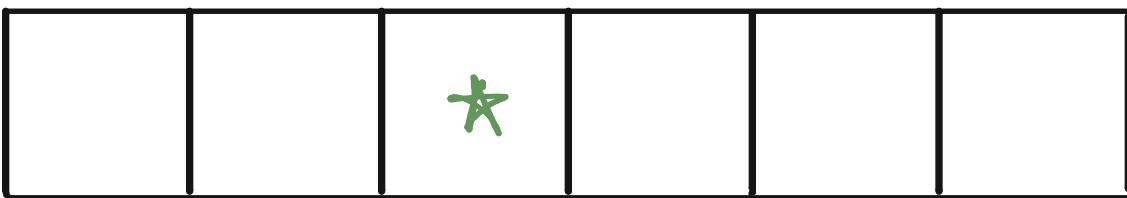
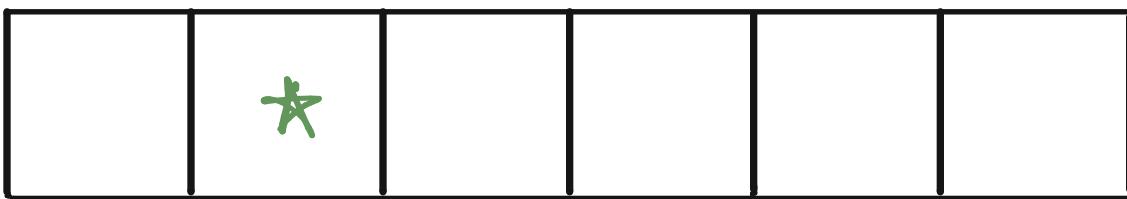
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Men's  
perspective :

$m_n$



$m_2$



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has not rejected

them yet.

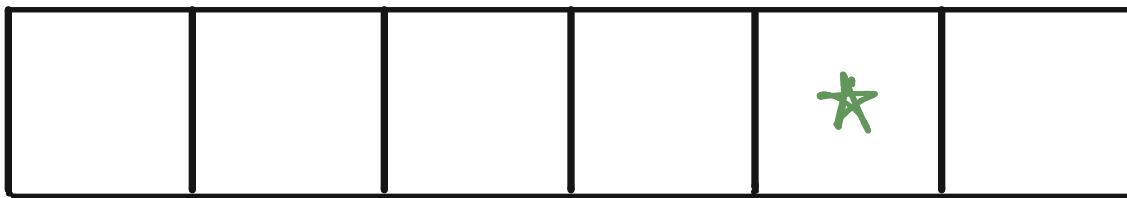
# ADVANCED ALGORITHMS (W1, P7)

## Greedy Algorithms

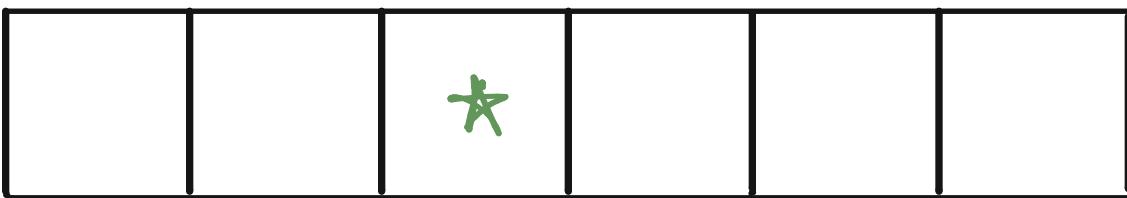
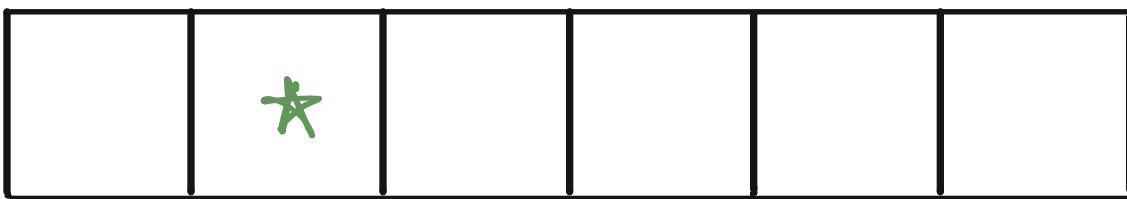
### Stable Matchings III

Men's  
perspective :

$m_n$



$m_2$



all "Single"

men

"propose"

to the

highest - ranked

woman who

has not rejected

them yet.

Stable Matchings III

Termination  
+

A man never proposes  
to the same woman  
more than once.

# proposals  $\leq n^2$ .

Stable Matchings III

The output is a matching

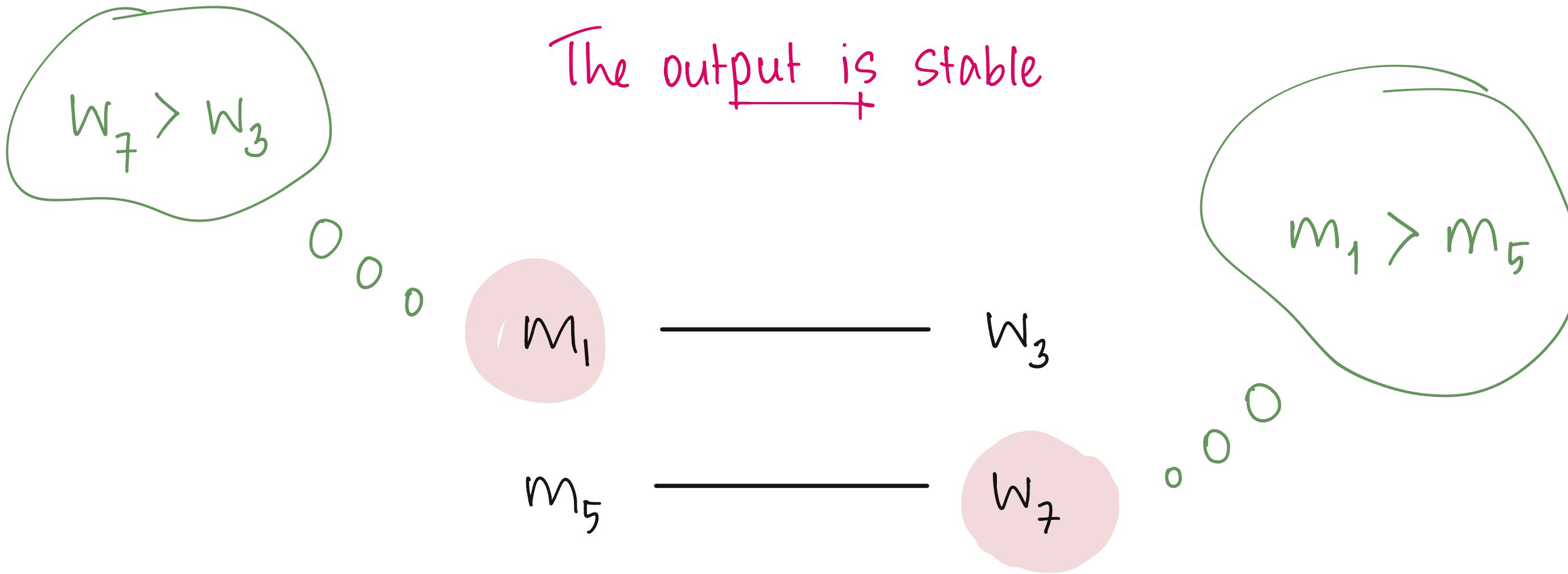
No man is single at the end

A man is matched w  $\leq$  1 woman  
at any stage of the algorithm.

# ADVANCED ALGORITHMS (W1, P7)

## Greedy Algorithms

### Stable Matchings III



$m_1$  proposed to  $w_7$  before  $w_3$ .  $w_7$  eventually rejected  $m_1$ .