
Data Structures and Algorithms

XMUT-COMP 103 - 2026 T1

More Examples on Algorithm Complexity

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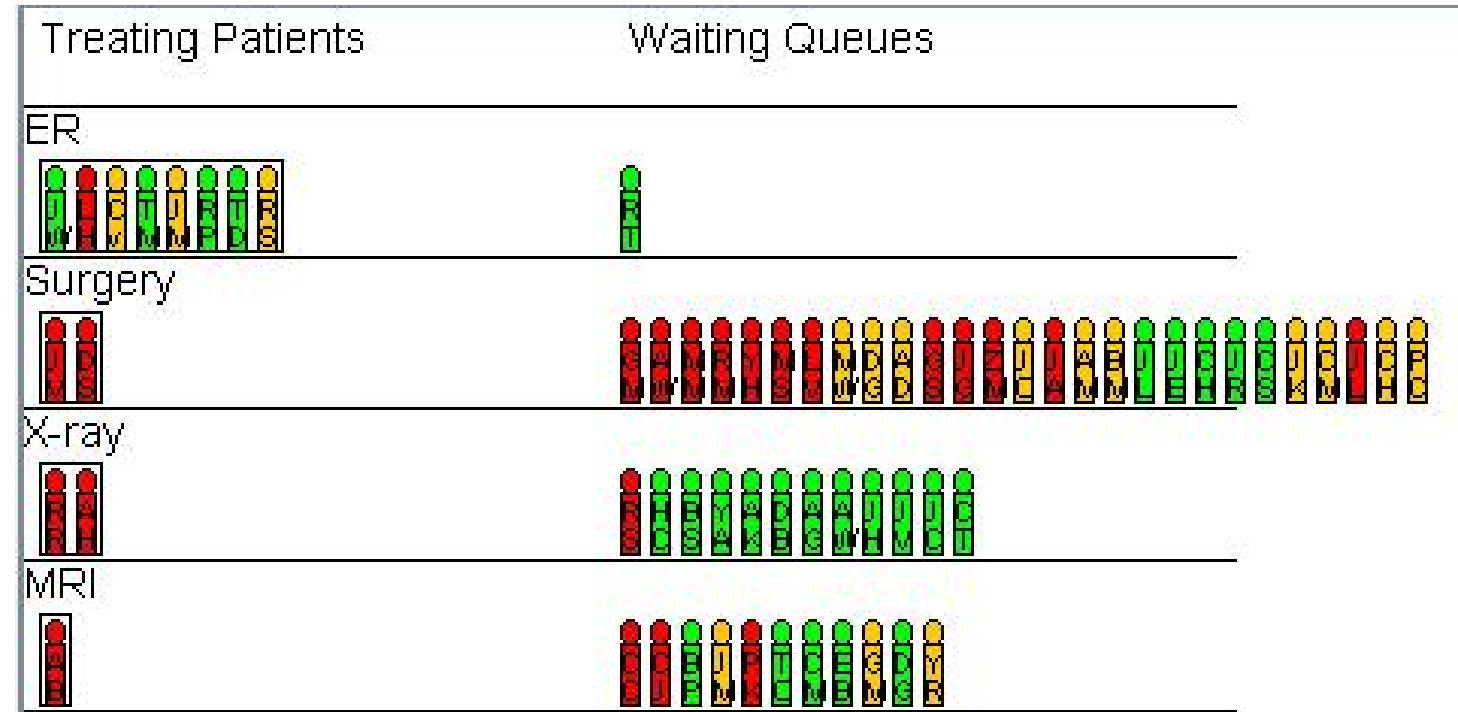
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Aside: Priority Queues

- Why aren't the Patients in priority order when waiting in the queue?

- Note:

- The front item in the priority queue is always the highest priority.
- Higher priority items tend to be closer to the front.
- But they aren't kept in exact order.



- Priority Queues keep the items in a partially ordered tree structure
 ⇒ more efficient to add and remove items [$O(\log n)$ instead of $O(n)$]
 more details later in the course.

Shuffle a list

Given a list, put items into a random order

```
23,22,49,25,43,23,5,31,43,27,21,45,43,16,5,21,18,27,39,18,21,7,42,28,21,19
```

- For each position, grab a random item and put it in that position
 - `add(position, remove(random))`
- vs
- `swap [set(position, set(index, get(position))]` or `Collections.swap(...)`

- Use the built-in shuffle!
 - `Collections.shuffle(list)`

Shuffle a list

n times

- For each position from $n-1$ to 0 ,
 - choose a random index \leq position
 - `item = remove(index)`
 - `add(position, item)`

$n \times O(1)$

$n \times O(n)$

$n \times O(n)$

Total: $O(n^2)$

n times

- For each position from $n-1$ to 0 ,
 - choose a random index \leq position
 - `swap(index, position)`

$n \times O(1)$

$n \times O(1)$

Total: $O(n)$

Combinations

- Given a set of n packets of weights w_1, \dots, w_n , and a shipping pallet/container/box that has size z
 - Example:



- Given the target z , what is the largest total weight $\leq z$ that can be achieved?
 - Example:

- $z \leq 10$?



Total Weight

$$3 + 7 = 10$$

- $z \leq 6$?



Total Weight

4

Combinations – Largest total weight

- Given a set of n packets of weights w_1, \dots, w_n
 - Example:



- What is the largest total weight of any combination?
 - Example:
 - The best combination:



- If all weights are positive, then selecting all packets gives the largest total weight

Combinations – List all

- Can we list all combinations with their respective total weight?

			Total Weight
	0		0
	1		3
	2		4
	3		7
Combinations	4		7
	5		10
	6		11
	7		14

- How many combinations are of n packets are there?

- 2^n

Combinations – Selecting Packets

- How can we ensure that we did not forget any combination?
 - We just decide for each packet whether it should be selected for the combination or not
 - Yes = “packet selected”, No = “packet not selected”

		3	4	7	Total Weight
Combinations	0	No	No	No	0
	1	Yes	No	No	3
	2	No	Yes	No	4
	3	No	No	Yes	7
	4	Yes	Yes	No	7
	5	Yes	No	Yes	10
	6	No	Yes	Yes	11
	7	Yes	Yes	Yes	14

How to represent combinations?

- Anything that can be improved?
 - For an algorithm we better use 1 and 0 rather than Yes and No

		3	4	7	Total Weight
	0	0	0	0	0
	1	1	0	0	3
	2	0	1	0	4
	3	0	0	1	7
	4	1	1	0	7
	5	1	0	1	10
	6	0	1	1	11
	7	1	1	1	14

- We use a binary representation for combinations:
 - Example: 011 stand for packets 2 and 3

How to represent combinations?

- Does this idea also work for more than 3 packets?
 - Yes, here an example for $n = 14$:
 - 10001110011010 stands for the packets 1, 5, 6, 7, 10, 11,13
- Step through all numbers from 0 to 111 to try all combinations
 - **for** combn from 0 to 111
 - work out total weight of combination
 - **if** weight \leq target and weight $>$ best so far
 - remember weight and combn

Cost of Algorithm with loop

- if n packets, then max combination represented by 2^n
 - for combn from 1 to max with n packets, max = 2^n
 - work out total weight of combination $O(n)$
 - if weight \leq target and weight $>$ best so far $O(1)$
 - remember weight and combn $O(1)$
- } 2^n times

Combinations – Can we do better?

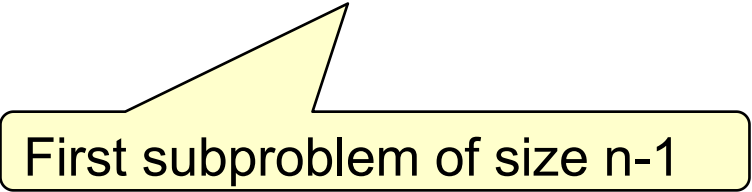
- Given a set of n packets of weights w_1, \dots, w_n , and a target z
 - Example:



- Idea: Consider two options
- First option: if packet 1 has weight \leq target z , then select it and we still have $n-1$ packets to choose from, but target must be reduced by the weight of packet 1
- Second option: do not select packet 1, then we still have $n-1$ packets to choose from, and target is still the same

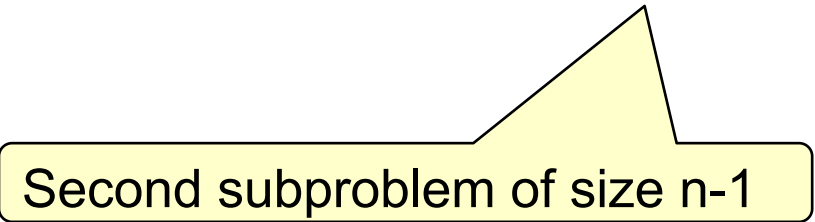
Combinations – Can we use recursion?

- Idea: divide the problem (of size n) into two smaller subproblems (of size $n-1$)
 - So we can use recursion
- First option: if packet 1 has weight \leq target z , then select it and we still have $n-1$ packets to choose from, but target must be reduced by the weight of packet 1



First subproblem of size $n-1$

- Second option: do not select packet 1, then we still have $n-1$ packets to choose from, and target is still the same



Second subproblem of size $n-1$

Combinations

- packet 0 yes no
- packet 1 yes no
- packet 2 yes no
- packet 3 yes no
- packet 4 yes no
- packet 5 yes no
- packet 6 yes no
- packet 7 yes no
- packet 8 yes no
- packet 9 yes no
- packet 10 yes no
- packet 11 yes no

Combinations – Using Recursion

- Start with an empty combination
- initialise bestCombination and bestTotal to 0;
- Find combinations using additional packets from index 0

- To find combinations using additional packets from index i ...:
 - // first option with first subproblem of size $n-1$*
 - if including packet i would still be \leq target
 - add it to the current combination
 - if it beats the current best, then remember total and combination.
 - find combinations using additional packets from index $i+1$... < RECURSIVE CALL
 - remove it from the current combination
 - // second option with second subproblem of size $n-1$*
 - find combinations using additional packets from index $i+1$... < RECURSIVE CALL

Cost of Algorithm with recursion

- $\text{Cost}(n)$ = cost of finding with n remaining packets to try
- $\text{Cost}(1) = O(1)$
- $\text{Cost}(n) = O(1) + \text{Cost}(n-1) + \text{Cost}(n-1)$
 $= 2 \text{Cost}(n-1) + O(1)$
 $= 2(2\text{Cost}(n-2) + O(1)) + O(1)$

The cost approximately doubles when n increase by 1 $\Rightarrow O(2^n)$