# Search space and brute force

If all you have is a hammer, everything looks like a nail

# Search Space

 Ensemble of all solutions we have to choose from to get the optimal answer.

 Often what is asked from us is not the solution but one of its properties.

# Search Space on an example : minimum pair

• Find the minimum pair on the list:

I.E. the pair with the minimum sum

0 5 8 6 -1 4 9 10 2



Search space : all the pairs

### Make sense of your search space

Another representation:

Matrix where:

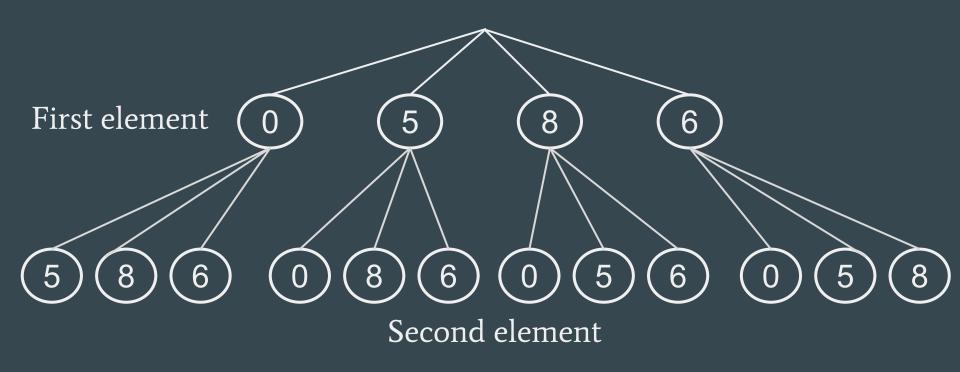
Line: first element of the pair

Column: second element

Implementation: two nested for loops



# Make sense of your search space



### Brute force - introduction

Example: I want to find all subsets of a set which sum is 42.

### I can:

- make a list of all subsets,
- for each subset, calculate the sum and check if it is 42.

Search space: all subsets of the input array

*Test:* the sum is 42

A brute force search has a search space and a test.

### Brute force - construct the search space

The python module <u>itertools</u> provides useful tools to construct the search space.

```
>>> list(product("ab", "cd"))
[('a', 'c'), ('a', 'd'), ('b', 'c'), ('b', 'd')]
>>> list(permutations("abc", 2))
[('a', 'b'), ('a', 'c'), ('b', 'a'), ('b', 'c'), ('c', 'a'), ('c', 'b')]
>>> list(combinations("abc", 2))
[('a', 'b'), ('a', 'c'), ('b', 'c')]
>>> list(combinations_with_replacement("abc", 2))
[('a', 'a'), ('a', 'b'), ('a', 'c'), ('b', 'b'), ('b', 'c'), ('c', 'c')]
```

*Note:* we use list() because the return values are *lazy-evaluated* iterables.

 $\rightarrow$  these are very useful to save memory

product(q<sub>1</sub>,q<sub>2</sub>,...,[repeat=1])

product('ABCD', repeat=2)

AA AB AC AD BA BB BC BD CA CB CC CD DA DB DC DD

Can take multiple iterables and output the <u>cartesian product</u> between them.

The repeat field indicate how many time do we take each iterable.

Complexity :  $O((\prod q_i)^{repeat})$ 

With repeat=2, the complexity is  $(q_1 * q_2)^2$ 

Where  $q_i$  is the size of each iterable.

permutation(p, [r=len(p)])

permutations('ABCD', 2)

AB AC AD BA BC BD CA CB CD DA DB DC

Take an iterable and create every permutation of length r.

A permutation is an ordered (order is important) of element without repetition.

Complexity :  $O(\frac{p!}{(p-r)!})$  For example with r=2, the complexity is p\*(p-1)

Where p is the size of the iterable p.

combinations(p, r)

combinations('ABCD', 2)

AB AC AD BC BD CD

Take an iterable and create every combination of length r.

A combination is a non ordered of element without repetition, since it is non ordered, AB and BA are the <u>same</u>.

Complexity: 
$$O(\binom{p}{r}) = O(\frac{p!}{r!(p-r)!})$$
 Here, it's  $\frac{p*(p-1)}{2}$ 

Where p is used as the size of the iterable p

combinations\_with\_replacement(p, r)

combinations\_with\_replacement('ABCD', 2) AA AB AC AD BB BC BD CC CD DD

Take an iterable and create every combination of length r with replacement.

Same as combination, but we can repeat the same element multiple times

Complexity: 
$$O(\binom{p+r-1}{r}) = O(\frac{(p+r-1)!}{r!(p-1)!})$$
 Here, it's  $\frac{(p+1)*p}{2}$ 

Where p is used as the size of the iterable p

### Brute force - let's solve our example

```
IN:
10 12 25 30 17 8 14 9 6

OUT:
(12, 30)
(25, 17)
(25, 8, 9)
(10, 12, 14, 6)
(10, 17, 9, 6)
```

gen is Python magic called a *generator expression*. Ask me if you want to know more.

### Why not to use brute force

There is a problem called <u>combinatorial explosion</u>.

TL;DR: the search space is often a lot bigger than the input size (e.g. exponential).

Previous example: for an array of size n, there are 2<sup>n</sup> - 1 non-empty subsets...

For an algorithm in O(n!) with n=30, your algorithm would still be running after the "end" of the universe.

$$10^{20} years < \frac{30!}{365 * 24 * 3600 * 10^9}$$

### Why <del>not</del> to use brute force

- Brute force is a good way to test if more complicated algorithms are correct.
   (you compare their results on small sets)
- Sometimes you just don't know a better algorithm. (password decryption...)

But, can't we reduce the search space a little bit?

 $\rightarrow$  often you can use *backtracking* (see you next week)

### **Credits**

Slides:

Louis Sugy, Arthur Tondereau, William Michaud