



Because computers do not speak Python...



Because computers do not speak Python...

A computer directly understands only one kind of language—its machine language. This language is different for different CPUs.



Because computers do not speak Python...

A computer directly understands only one kind of language—its machine language. This language is different for different CPUs.

Machine language is just numbers in the memory:

21 37 158 228 255 10 49 26 88 250 12 ...



Because computers do not speak Python...

A computer directly understands only one kind of language—its machine language. This language is different for different CPUs.

Machine language is just numbers in the memory:

21 37 158 228 255 10 49 26 88 250 12 ...

Each number means some instruction: load value from memory to CPU register. Add two register values. Store register value to memory. Compare two numbers. Jump to a new memory address.



Machine language instructions are very fast: A 2 GHz processor executes 2,000,000,000 instructions per second!



Machine language instructions are very fast: A 2 GHz processor executes 2,000,000,000 instructions per second!

But machine instructions are very primitive, and nobody programs in machine language anymore.



Machine language instructions are very fast: A 2 GHz processor executes 2,000,000,000 instructions per second!

But machine instructions are very primitive, and nobody programs in machine language anymore.

Python uses an interpreter: An interpreter is a program that reads your Python code and executes its instructions one after another.



Machine language instructions are very fast: A 2 GHz processor executes 2,000,000,000 instructions per second!

But machine instructions are very primitive, and nobody programs in machine language anymore.

Python uses an interpreter: An interpreter is a program that reads your Python code and executes its instructions one after another.

Other interpreted languages are Java, MATLAB, or Flash.



Machine language instructions are very fast: A 2 GHz processor executes 2,000,000,000 instructions per second!

But machine instructions are very primitive, and nobody programs in machine language anymore.

Python uses an interpreter: An interpreter is a program that reads your Python code and executes its instructions one after another.

Other interpreted languages are Java, MATLAB, or Flash.

Languages such as C, C++, or FORTRAN are compiled. The input program (source code) is converted to a numeric format that contains machine instructions.



Using an interpreter is like making a dish using a cooking book in a foreign language that you cannot read well. You need to look up many words, and you execute the recipe slowly.

Fondant au chocolat

par Crevette

Pour 6 personnes : Préparation : 20 min Cuisson : 30 min

Ingrédients :

200 g de chocolat pâtissier 60 g de beurre 4 cuillerées à soupe de farine 4 œufs 150 g de sucre



Préparation :

Faire fondre le chocolat au bain-marie. Séparer les jaunes d'œufs des blancs.

Ajouter le beurre ramolli au chocolat fondu, ensuite les jaunes d'œufs, le sucre et la farine.

Montez les blancs d'œufs en neige bien ferme. Incorporez-les délicatement au mélange. Cuire au four à 180°C (th.6) pendant environ 30 minutes.



Using an interpreter is like making a dish using a cooking book in a foreign language that you cannot read well. You need to look up many words, and you execute the recipe slowly.

When we have to cook the same dish many times, it is more efficient to first translate the recipe and to write it down in your mother tongue. This is what a compiler does.



Using an interpreter is like making a dish using a cooking book in a foreign language that you cannot read well. You need to look up many words, and you execute the recipe slowly.

When we have to cook the same dish many times, it is more efficient to first translate the recipe and to write it down in your mother tongue. This is what a compiler does.

It takes time and effort to do the translation and to write it down. It is not worth doing that if we only cook the dish once. But now we can cook the dish many times quickly.



Why interpreters?

The Python shell interactively executes our instructions, so we can experiment with objects of different types and test their behavior.





The Python shell interactively executes our instructions, so we can experiment with objects of different types and test their behavior.

We can also interactively explore data, or perform mathematical analysis (try symbolic differentiation in C++!).



The Python shell interactively executes our instructions, so we can experiment with objects of different types and test their behavior.

We can also interactively explore data, or perform mathematical analysis (try symbolic differentiation in C++!).

An interpreter makes it easier to debug a program, because changing the program is fast. We can also look at the objects created in the program.



The Python shell interactively executes our instructions, so we can experiment with objects of different types and test their behavior.

We can also interactively explore data, or perform mathematical analysis (try symbolic differentiation in C++!).

An interpreter makes it easier to debug a program, because changing the program is fast. We can also look at the objects created in the program.

Memory-management is done automatically by the interpreter.



Why is Photoshop faster than our 'posterize' function?



Why is Photoshop faster than our 'posterize' function?

 Photoshop is written in C++ and compiled to machine language.



Why is Photoshop faster than our 'posterize' function?

- Photoshop is written in C++ and compiled to machine language.
- Photoshop uses smarter algorithms.



Why is Photoshop faster than our 'posterize' function?

- Photoshop is written in C++ and compiled to machine language.
- Photoshop uses smarter algorithms.

A smart algorithm in an interpreted language can easily beat a simple algorithm in a compiled language.





Here is a simple algorithm to sort a list a:

```
for i in range(len(a) - 1):
   for j in range(len(a) - 1):
     if a[j] > a[j+1]:
      a[j], a[j+1] = a[j+1], a[j]
```



Here is a simple algorithm to sort a list a:

```
for i in range(len(a) - 1):
   for j in range(len(a) - 1):
     if a[j] > a[j+1]:
     a[j], a[j+1] = a[j+1], a[j]
```

If the list a has n elements, then the if statement is executed $(n-1)^2$ times.



Here is a simple algorithm to sort a list a:

```
for i in range(len(a) - 1):
   for j in range(len(a) - 1):
    if a[j] > a[j+1]:
       a[j], a[j+1] = a[j+1], a[j]
```

If the list a has n elements, then the if statement is executed $(n-1)^2$ times.

On a 2.8 GHz desktop, sorting 10000 numbers takes 20 seconds.



We partition the list into small pieces of one element.



We partition the list into small pieces of one element.

Then we merge pieces together in pairs, until the whole list is sorted.



We partition the list into small pieces of one element.

Then we merge pieces together in pairs, until the whole list is sorted.

Merging two sorted lists **a** and **b** is easy, as in each step we only need to select an element from either **a** or **b**.



We partition the list into small pieces of one element.

Then we merge pieces together in pairs, until the whole list is sorted.

Merging two sorted lists **a** and **b** is easy, as in each step we only need to select an element from either **a** or **b**.

We can show that this algorithm compares two list elements only $n\log_2 n$ times.



We partition the list into small pieces of one element.

Then we merge pieces together in pairs, until the whole list is sorted.

Merging two sorted lists **a** and **b** is easy, as in each step we only need to select an element from either **a** or **b**.

We can show that this algorithm compares two list elements only $n\log_2 n$ times.

Sorting 10000 numbers on the same desktop computer takes 0.1 seconds. One million numbers can be sorted in 11 seconds.



Algorithm analysis

Designing efficient algorithms for a problem is a fundamental branch of computer science.



Algorithm analysis

Designing efficient algorithms for a problem is a fundamental branch of computer science.

Here, "efficient" means that we can prove that the number of operations made by the algorithm is bounded by some function of the problem size n.



Algorithm analysis

Designing efficient algorithms for a problem is a fundamental branch of computer science.

Here, "efficient" means that we can prove that the number of operations made by the algorithm is bounded by some function of the problem size n.

An algorithm is optimal if we can prove that no algorithm can possibly solve the problem with a smaller number of operations (asymptotically).





Designing efficient algorithms for a problem is a fundamental branch of computer science.

Here, "efficient" means that we can prove that the number of operations made by the algorithm is bounded by some function of the problem size n.

An algorithm is optimal if we can prove that no algorithm can possibly solve the problem with a smaller number of operations (asymptotically).

We can prove that it is impossible to sort n numbers with less than $n \log_2 n$ comparisons, and therefore Merge Sort is optimal.



"Recursion" means to define something in terms of itself.



"Recursion" means to define something in terms of itself.

A folder is a collection of files and folders.



"Recursion" means to define something in terms of itself.

A folder is a collection of files and folders.

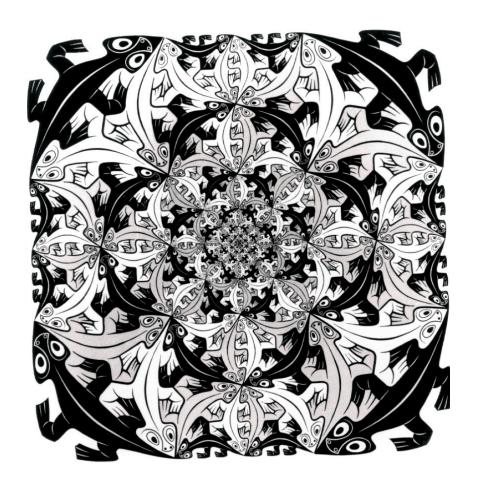
Words in dictionaries are defined in terms of other words.



"Recursion" means to define something in terms of itself.

A folder is a collection of files and folders.

Words in dictionaries are defined in terms of other words.





A recursive function

How would you implement this function?

```
>>> downup("Hello")
Hello
Hell
Hel
Не
Η
Не
Hel
Hell
Hello
```





How would you implement this function?

```
>>> downup("Hello")
Hello
Hell
                   My solution:
Hel
                   def downup(w):
He
                     print w
H
                     if len(w) <= 1:
Не
                        return
Hel
                     downup(w[:-1])
Hell
                     print w
Hello
```



How would you implement this function?

```
>>> downup("Hello")
Hello
Hell
                    My solution:
Hel
                    def downup(w):
Не
                      print w
H
                      if len(w) <= 1:
Не
                        return
Hel
                      downup(w[:-1])
Hell
                      print w
Hello
                                   recursive call
```



Printing in any base

How do you print a number in binary? Or in base 8?





How do you print a number in binary? Or in base 8?

The last digit of number n in base b is easy: n % b



How do you print a number in binary? Or in base 8?

The last digit of number n in base b is easy: n % b

The remaining digits are the representation of n / b in base b:

```
def to_radix(n, b):
    if n < b:
        return str(n)
    s = to_radix(n / b, b)
    return s + str(n % b)</pre>
```



Merge Sort is recursive

Merge Sort is an example of a more interesting recursive algorithm: it uses two recursive calls:

```
def merge_sort(a):
    if len(a) <= 1:
        return
    m = len(a)/2
    a1 = a[:m]
    a2 = a[m:]
    merge_sort(a1)
    merge_sort(a2)
    merge(a, a1, a2)</pre>
```





Merge Sort is an example of a more interesting recursive algorithm: it uses two recursive calls:

```
def merge_sort(a):
    if len(a) <= 1:
        return
    m = len(a)/2
    a1 = a[:m]
    a2 = a[m:]
    merge_sort(a1)
    merge_sort(a2)
    merge(a, a1, a2)</pre>
```

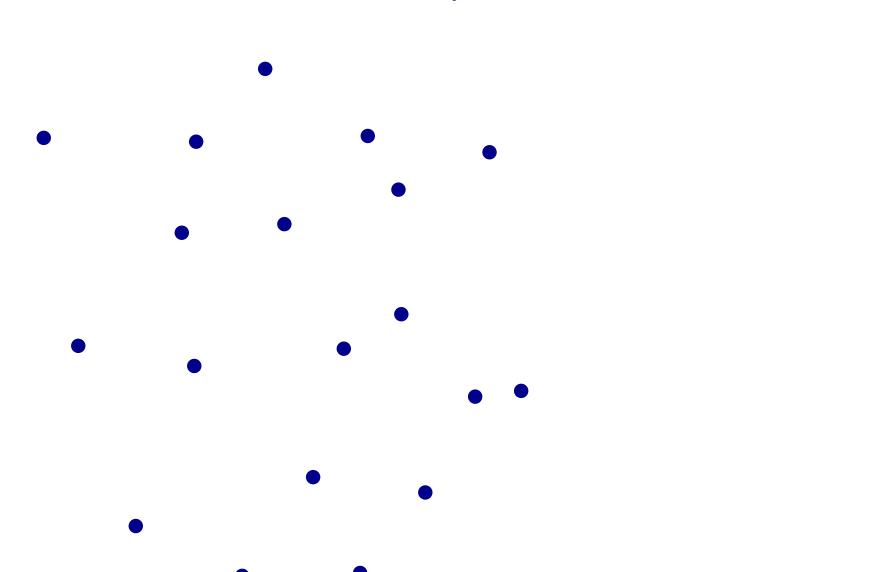
Divide & Conquer: Divide a problem into two smaller problems. Solve the smaller problems, and combine the solutions.



Travelling Salesman: Given n points in the plan, find the shortest tour that visits all the points.



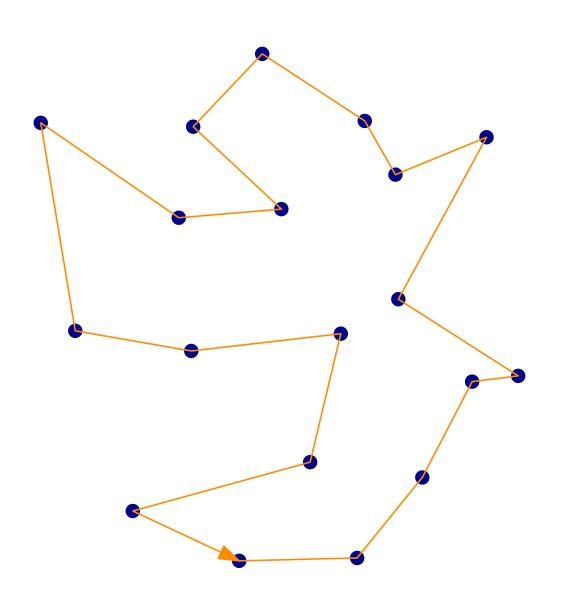
Travelling Salesman: Given n points in the plan, find the shortest tour that visits all the points.





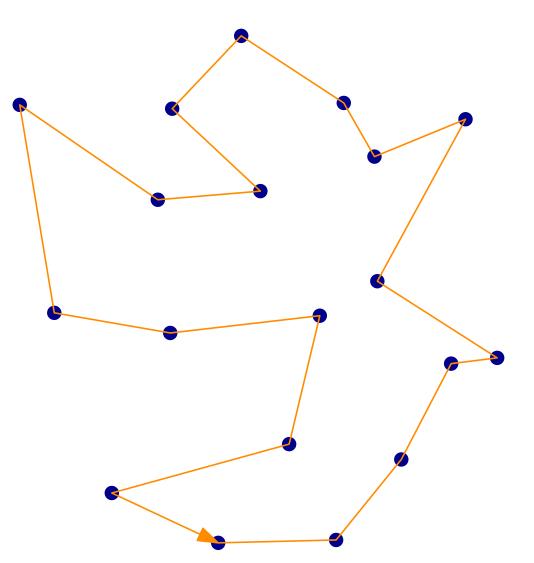
KAIST CS101 Efficient algorithms for everything?

Travelling Salesman: Given n points in the plan, find the shortest tour that visits all the points.





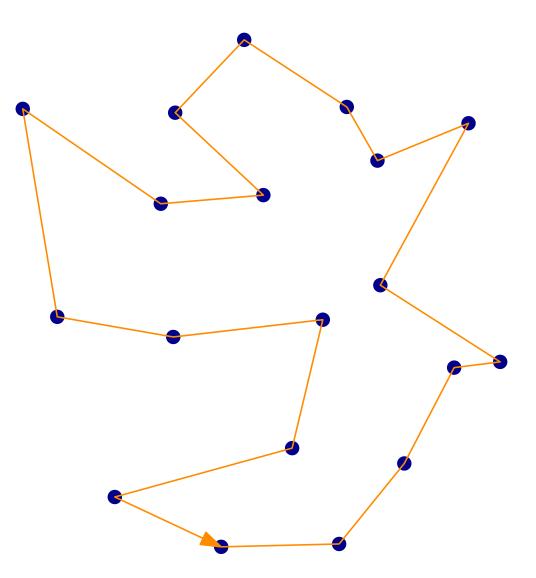
Travelling Salesman: Given n points in the plan, find the shortest tour that visits all the points.



Best known algorithm needs roughly 2^n operations.



Travelling Salesman: Given n points in the plan, find the shortest tour that visits all the points.

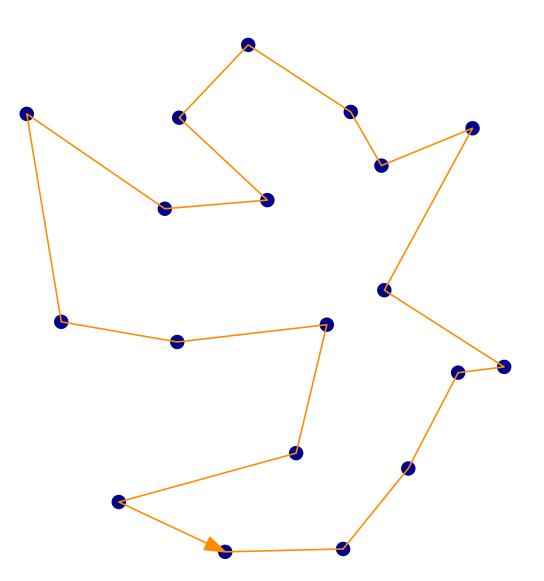


Best known algorithm needs roughly 2^n operations.

Nobody can prove that n^2 operations is impossible.



Travelling Salesman: Given n points in the plan, find the shortest tour that visits all the points.



Best known algorithm needs roughly 2^n operations.

Nobody can prove that n^2 operations is impossible.

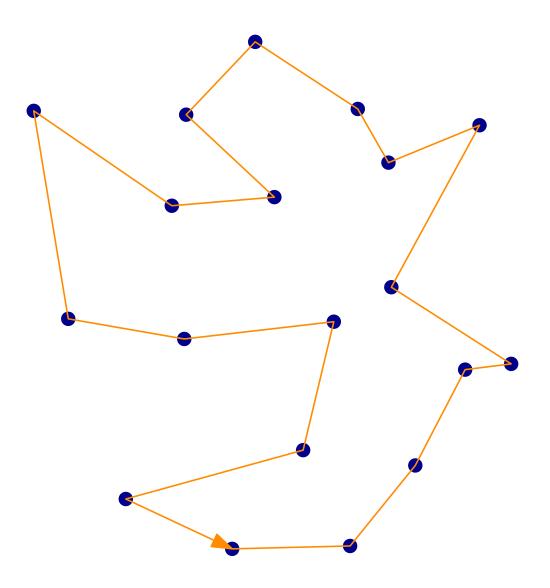
Million-dollar question:

$$P = NP$$
 ?





Travelling Salesman: Given n points in the plan, find the shortest tour that visits all the points.



Best known algorithm needs roughly 2^n operations.

Nobody can prove that n^2 operations is impossible.

Million-dollar question:

$$P = NP$$
 ?

There are problems for which we can prove that no algorithm exists.



We learnt a language for expressing computations (Python).



We learnt a language for expressing computations (Python).

We learnt about the process of writing and debugging a program.



We learnt a language for expressing computations (Python).

We learnt about the process of writing and debugging a program.

We learnt about abstractions (data and functions).



We learnt a language for expressing computations (Python).

We learnt about the process of writing and debugging a program.

We learnt about abstractions (data and functions).

We learnt about breaking problems into smaller pieces, and testing parts of a program one-by-one.



We learnt a language for expressing computations (Python).

We learnt about the process of writing and debugging a program.

We learnt about abstractions (data and functions).

We learnt about breaking problems into smaller pieces, and testing parts of a program one-by-one.

Remember that you can program to find answers to questions.





We learnt a language for expressing computations (Python).

We learnt about the process of writing and debugging a program.

We learnt about abstractions (data and functions).

We learnt about breaking problems into smaller pieces, and testing parts of a program one-by-one.

Remember that you can program to find answers to questions.

THE END