

*Dynamic
Programming.*

Longest Increasing Subsequence. (LIS).

e.g.	Index.	0	1	2	3	4.
	Nums	1	4	3	4	2

$\text{dp}[3] = 3$ $\text{dp}[4] = 2$
 \downarrow \downarrow
 $1 \rightarrow 3 \rightarrow 4$ $1 \rightarrow 2$
 $\text{longest} = 3$ \downarrow
 $\text{longest} = 2$.

Index.	0	1	2	3	4.	5
Nums	1	4	3	4	2	3
dp	1	2	2	3	2	?

How could we find $\text{dp}[5]$ based on prev?

Similar to Dijkstra's shortest path algo.

We search for $\text{Num}[i] < \text{Num}[5]$

with $\max \& \text{dp}[i]$.

\Rightarrow when $i=0, i=4$

$$\text{Num}[0] = 1 \quad \text{Num}[4] = 2$$

$$\text{dp}[0] = 1 \quad \underline{\text{dp}[4] = 2}$$

$$\text{So } \text{dp}[5] = 3 \text{ by } \text{Num}[4]$$

Convert the logic into pseudo code:

Index.	0	1	2	3	4.	5
Nums	1	4	3	4	2	3
dp	1	2	2	3	2	?

Let i to be result index. j to be prev index.

for (int $j=0$: $j < i$: $j++$) {

if ($\text{Nums}[j] < \text{Nums}[i]$) {

$\text{dp}[i] = \text{Math.max}(\underline{\text{dp}[i]}, \text{dp}[j+1])$;

 └ compare to the best result so far.

}

}

Then the logic can be combined:

for (int $i=0$: $i < \text{num.size}()$: $i++$) {

 prevCode;

}

Then loop thru $\text{dp}[i]$, return $\max \text{dp}[i]$.

Time Complexity is $O(n^2)$.

Adding itself

Given k numbers of coin type, they're c_1, c_2, \dots, c_n .

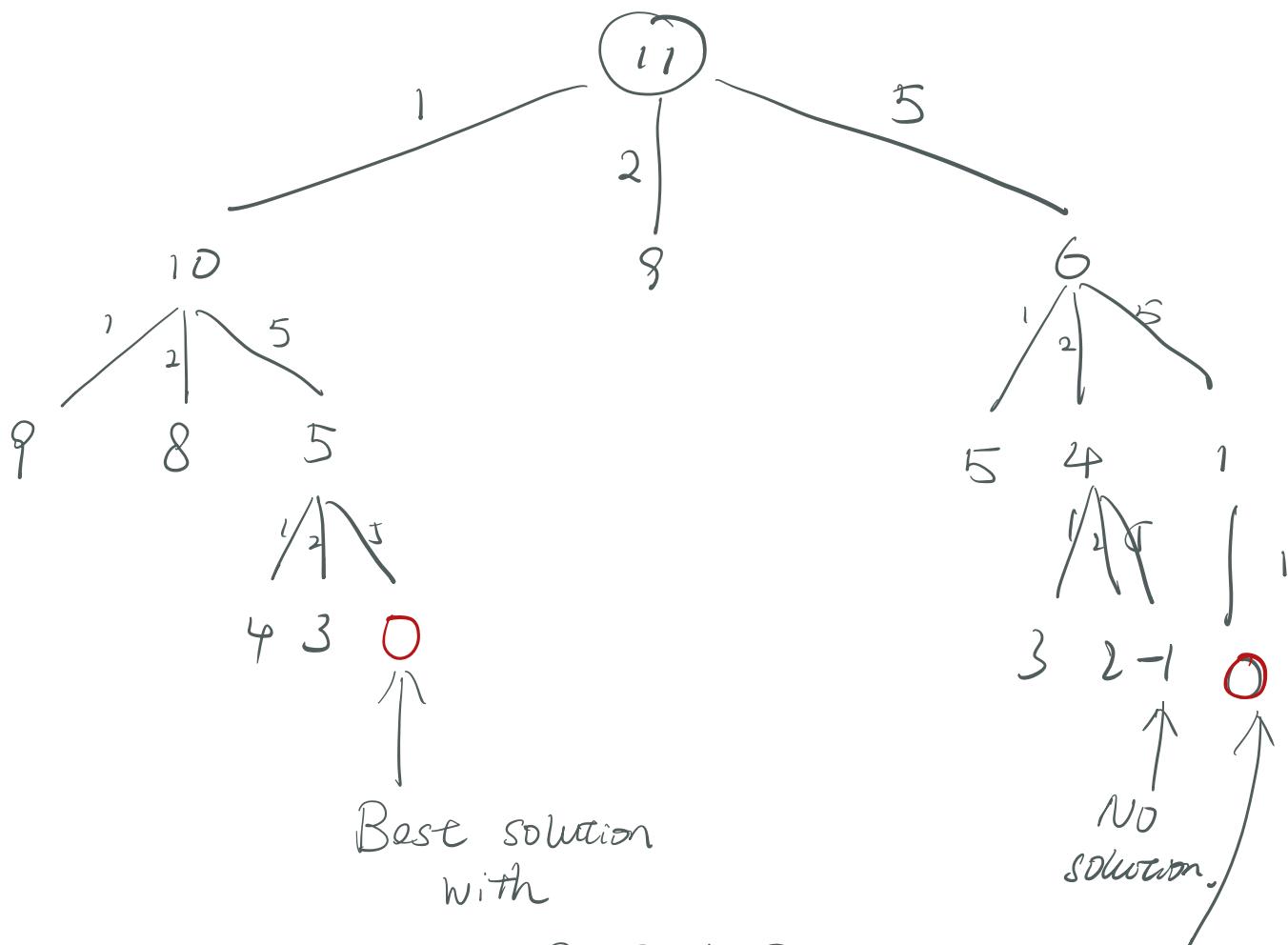
Asking for min amount of coins to get to total. ∞

e.g. $k=3$, $\begin{array}{c} 1 \\ \swarrow \quad \searrow \\ 2 \quad 5 \end{array}$

零钱问题.

Asking amount = 11.

$\therefore 3$ coins $\Rightarrow 5+5+1 = 11.$



MIN TREE HEIGHT.

$$dp(n) = \begin{cases} 0, & n=0 \\ -1, & n < 0 \quad (\text{No solution}). \\ \min \{ dp(n-c_i) + 1 \mid c_i \in \text{coins}\}, & n > 0. \end{cases}$$

We could also use table to reduce some unnecessary calculation,
similar to fib number solution.

- A bag can load

背包问题.

\swarrow or \searrow
W Weight N object

- Now we have

Object	Weight	Value
i	Wt[i]	Val[i]

e.g. bag can load < 3 object
4 weight.

i	Wt[i]	Val[i]
1	2	4
2	1	2
3	3	3

Should we consider
value per weight.
As factor?

so we will choose $i=1, i=2$ into bag,
total value of 6. = Value-max.

① Status Capacity.
 Objects

② Choice Object go in to the bag.
 Object NOT go in to the bag.

Structure for dp:

```
for statusAIndex in allStatusA {
    for statusBIndex in allStatusB {
```

$$dp[\text{statusA}][\text{statusB}] = \text{Best}(\text{choiceA}, \text{choiceB});$$

```
}
```

base case $\begin{cases} dp[0][\dots] = 0 \\ dp[\dots][0] = 0. \end{cases}$

In this case:

for i in $[1 \dots n]$:

for w in $[1 \dots W]$:

$$dp[i][w] = \max \left(\begin{array}{l} \text{把 } i \text{ 装进背包, 不把 } i \text{ 装进背包} \\ // \end{array} \right)$$

return $dp[N][W];$

What is $dp[i][w]$?

对于前 i 个物品，当前背包容量为 w 时，
该情况下，可以装下的最大价值为 $dp[i][w]$.

If we want object i into bag.

then maxValue must contain $val[i]$.

Then the capacity of bag is

$$W - wt[i]$$

We want to put maxValue objects into
the rest of this capacity.

Hence,

$$val[i] + dp[i-1][W - wt[i]]$$

$$dp[i][w]$$

Put in bag.

OR



NOT Put in bag.

$$val[i-1] + dp[i-1][W - wt[i-1]]$$

$$dp[i-1][w]$$

$i-1$ because 0 is base case, where bag is empty.
so in actual case, we need to Shift 1 for weight and value.

Balanced Partition Problem (分割等和子集).

Given set [1, 5, 11, 5]

Separate into two equal size sets.

Return [1, 5, 5] & [11].

This is another type of backpack question.

The capacity of the bag is $\text{sum}/2$.

Edit distance problem. (编辑距离)

Q:

Change the word1 to word2 with min operation.

Operations: 
insert
delete
replace

e.g. word1 = "horse" word2 = "ros"

Return = 3 \Rightarrow horse \rightarrow rorse
 rorse \rightarrow rose
 rose \rightarrow ros

A: Normally when we see comparing two strings,
we will use two pointers.

S_1	r	a	d	i e	
S_2	a	p	p	j l e	

$S_1[i] \neq S_2[j]$
v operation.
insert e

S_1	r	a	d	i L e	
S_2	a	p	p	j l e	

$S_1[i] \neq S_2[j]$
v operation.
insert l

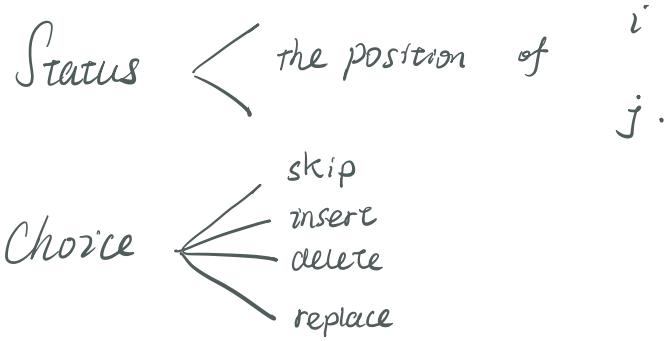
S_1	r	a	d p	i L e	
S_2	a	p	p	j l e	

$S_1[i] \neq S_2[j]$
v operation.
replace d to p

S_1	r	a	i p	L e	
S_2	a	p	p	j l e	

$S_1[i] \neq S_2[j]$
v operation.
insert p
and
delete r.

5 times operation.



definition : $\text{dp}(i..j)$. will return min edit distance for $S_1[0..i]$ & $S_2[0..j]$

base case :

$i == -1$ return $j + 1$

$j == -1$ return $i + 1$

S_1 i
 r a p p l e
 S_2 j a p p l e

} if j reaches -1 ,
 which means comparison finished.

all characters at and at the left of i
 must be deleted.

if S_1 is finished, but S_2 .

the operations to delete these
 are $i + 1$,
 because index $\cdot 0$ is a number.

i	S_1 a p p l e 0 1 2 3 S_2 l o r e a p p l e
-----	---

We need to have $4 = (j+1)$ operations
 to insert these characters.

```

1 def minDistance(s1, s2) -> int:
2     # 定义: dp(i, j) 返回 s1[0..i] 和 s2[0..j] 的最小编辑距离
3     def dp(i, j):
4         # base case
5         if i == -1: return j + 1
6         if j == -1: return i + 1
7
8         if s1[i] == s2[j]:
9             return dp(i - 1, j - 1) # 做什么都不做 ✓
10        else:
11            return min(
12                dp(i, j - 1) + 1,      # 插入
13                dp(i - 1, j) + 1,      # 删除
14                dp(i - 1, j - 1) + 1 # 替换
15            )
16
17    # i, j 初始化指向最后一个索引
18    return dp(len(s1) - 1, len(s2) - 1)

```

0 1 2 3 4
 apple size = 5.
 that's why -1.

Insertion is inserting another character next to current index.

S_1 r a d i L e j	$S_1[i] \neq S_2[j]$ ↓ operation. insert l
S_2 a p p L e	

So index i cannot move since not matched yet,

j more forward, resulting $dp(i, j-1) + \underline{l}$

adding one operation

However similar to all other dp question,

which will repeatedly calculate some value. (重叠子问题).

There are two ways of solving <^{memo}_{dp table}.

Memo (dictionay):

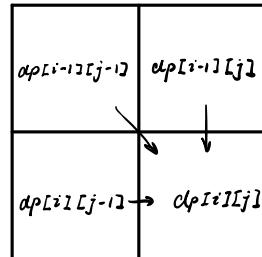
Simply store the info
in memo,
then check memo each time.

```
1 def minDistance(s1, s2) -> int:  
2  
3     memo = dict() # 备忘录  
4     def dp(i, j):  
5         if (i, j) in memo:  
6             return memo[(i, j)]  
7         ...  
8  
9         if s1[i] == s2[j]:  
10            memo[(i, j)] = ...  
11        else:  
12            memo[(i, j)] = ...  
13        return memo[(i, j)]  
14  
15    return dp(len(s1) - 1, len(s2) - 1)
```

dp table:

s_2	"	a	p	p	l	e
s_1	0	1	2	3	4	5
r	1	1 ^①	2 ^②	3	4	5
a	2	1	2	3	4	5
d	3	2	2	3	4	5

PINK indicates base case.



Based on the relationship, we can calculate in this order.

依赖关系.

Eventually final result.

```

1 int minDistance(String s1, String s2) {
2     int m = s1.length(), n = s2.length();
3     int[][] dp = new int[m + 1][n + 1];
4     // base case
5     for (int i = 1; i <= m; i++)
6         dp[i][0] = i;
7     for (int j = 1; j <= n; j++)
8         dp[0][j] = j;                         prer was 自顶向下.
9     // 自底向上求解
10    for (int i = 1; i <= m; i++)
11        for (int j = 1; j <= n; j++)
12            if (s1.charAt(i-1) == s2.charAt(j-1))
13                dp[i][j] = dp[i - 1][j - 1];
14            else
15                dp[i][j] = min(
16                    dp[i - 1][j] + 1,
17                    dp[i][j - 1] + 1,
18                    dp[i-1][j-1] + 1
19                );
20    // 储存着整个 s1 和 s2 的最小编辑距离
21    return dp[m][n];
22 }
23
24 int min(int a, int b, int c) {
25     return Math.min(a, Math.min(b, c));
26 }
```

String

Matching

Robin - Karp Algorithm.

Originally, check of P in S .

$$S = "a a a a a b"$$

$$P = "a a a b"$$

We need to check P with $S_1 \cup S_4$,
then $S_2 \cup S_5$, $S_3 \cup S_6$ etc
until they matched.

Time complexity: $O(n \times m)$ where $n = \text{lens}(S)$
 $m = \text{lens}(P)$.

But we can check the hashing value.

$$S = "a a a a a b"$$

$$P = "a a a b"$$

$$h(a a a a) = h_t \leftarrow \text{A number}$$

$$h(a a a b) = h_p \rightarrow \text{Another number.}$$

Using sliding window in S to see any $h_t == h_p$.
if hashing number matched,
we compare each character inside hashing window S with P .

Rolling hash :

if ASCII value table is following:

a	b	c	d	e
1	2	3	4	5	

S = a b c d e f g h i ...

P = c a e f.

$$h_{\text{pattern}} = (3 + 4 + 5 + 6) \cdot 18$$

$$h_{\text{abcd}} = (1 + 2 + 3 + 4) = 10$$

THEN:  reuse

$$\begin{aligned} h_{\text{bcde}} &= 10 - \frac{\alpha}{\text{"}} + \frac{\epsilon}{\text{"}} \\ &\quad | \quad | \\ &\quad 1 \quad 5 \\ &= 14 \end{aligned}$$

SO constant search time (2) regardless pattern length.

Time Complexity : $O(m+n)$

IF

no collision (e.g. same fare hashing value).

 $O(m \times n)$ in worst case if all collided.
solution.

S = a b c d e f g h i ...

P = c a e f.

Add a multiplier: 10^{n-1} where n is the character position from right.

$$habcd = h(1, 2, 3, 4).$$

$$= 1 \times 10^3 + 2 \times 10^2 + 3 \times 10^1 + 4 \times 10^0$$

$$= 1234$$

so continue rounding method for bcd

$$\begin{aligned} habcd &= habcd - ha + he \\ &= \left(- 1 \times 10^3 \right) \times 10 + 5 \\ &\quad \uparrow \\ &\quad \text{shift left.} \end{aligned}$$

$$= 2345$$

However if length is 100, 10^{100} will cause overflow.

→ Involve appropriate mod operation.

e.g. $habcd = h(1, 2, 3, 4)$.

$$\cdot (1 \times 10^3 + 2 \times 10^2 + 3 \times 10^1 + 4 \times 10^0) \bmod \underbrace{113}_{\substack{\text{A number decided by} \\ \text{yourself.}}}$$

so the number will within range of $[0, 113]$

But $10^{99} \bmod 113 = ?$

Since. $(A \times B) \bmod c = ((A \bmod c) \times (B \bmod c)) \bmod c$.

$$\hookrightarrow 10^2 \bmod 113 = ((10 \bmod 113) \times (10 \bmod 113)) \bmod 113.$$

↪ for () {

$$n = (n \times 10) \% 113$$

}

KMP Substring Search.

Originally, check of P in S .

$S = "a a a a a b"$

$P = "a a a b"$

We need to check P with $S_1 \cup S_4$,
then $S_2 \cup S_5$, $S_3 \cup S_6$ etc
until they matched.

Time complexity: $O(n \times m)$ where $n = \text{lens}(S)$
 $m = \text{lens}(P)$.

However, in KMP,

we take advantage of
successful character comparison.
(avoiding unnecessary comparison).

$S = a d s g w a d s x d s g w a d s g z$

$P = a s g w a d s g z$

$S = \underline{a \ d \ s \ g \ w \ a \ d \ s} \ x \ d \ s \ g \ w \ a \ d \ s \ g \ z$
↖ not match
 $P = \underline{d \ s \ g \ w \ a \ d \ s} \ g \ z$

In brute force, we need to start at $S[2]$ and compare P again.
 But now

We are looking for,

a suffix which is also a prefix.

$S = a \ \underline{d \ s} \ g \ w \ a \ \underline{d \ s} \ x \ d \ s \ g \ w \ a \ d \ s \ g \ z$
 $P = \underline{d \ s} \ g \ w \ a \ \underline{d \ s} \ g \ z$

then no need to compare the known part,

compare the prefix of P with suffix of S .

Prefix - Suffix Table.

Compare i & j. Advance j if no match

i	j
d	s
0	1
s	w
0	2
w	a
0	3
a	d
0	4
d	s
1	5
s	g
0	6
g	z
7	8

Table

Table = where to start matching in P after a mismatch at $i+1$.

advance both i and j.

i	i	j	j
d	s	g	w
0	1	2	3
s	w	a	a
0	0	0	4
w	a	d	d
0	0	1	5
a	d	s	s
0	0	2	6
d	s	g	g
1	1	7	7
s	g	z	8

Table

↑ ↓ ↑ if this is a mismatch.

we dont need to move i back to 0,

we move i to 2.

because S told me!

Combined:

$S = a \underline{d s g w} a d s \underline{x} d s g w a d s g z$

$P = \underline{d s g w} a d s \underline{g z}$

Table

d	s	g	w	a	d	s	g	z
0	0	0	0	0	1	2	3	0

check last match item in table

go to index 2.

$S = a d s g w a d s \underline{x} d s g w a d s g z$

$P = \underline{\cancel{d}} s \underline{\cancel{g}} w a d s g z$

we are going from x in S ,
 g in P .

But table [g] = 0. Back to d .

Compare d with x . \rightarrow not match

↓
advance S .

Time Analysis:

Building table : $O(m)$

$$n = \text{lens}(S)$$
$$m = \text{lens}(P).$$

Matching traversal : $O(n)$.

Overall : $\underline{\underline{O(m+n)}}$

Intractability.

Easy to solve

P (within
polynomial
time)

NP

X

Easy to verify.

✓

✓

Example.

prime number

拼图 jigsaw.

Cook Theorem:

Every NP problem is polynomially reducible to the SAT problem.

SAT == NP-Complete.