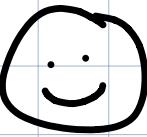


Administrivia

- Save, then quit
- 9:41
- Piazza 
- L^AT_EX template RSN™

Dynamic Programming 2

1. Recurrence

- English description first

2. Memoize

- Identify subproblems
- Data structures

3. On Purpose

- Dependencies
- Order

4. Analysis

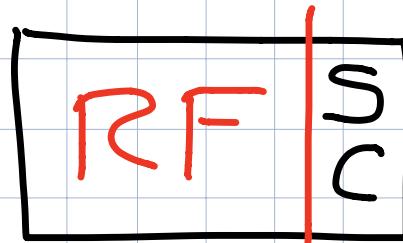
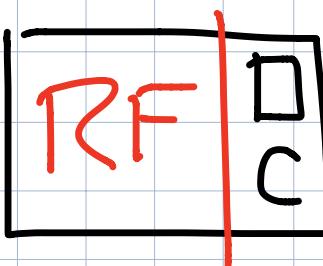
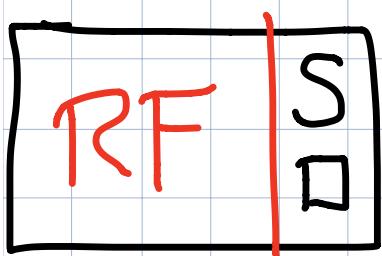
(5. Optimize)

Edit distance

min # insertions

deletions
replacements

to change A into B



$\text{Edit}(A[1..m], B[1..n]) =$

$$\min \left\{ \begin{array}{l} \text{Edit}(A[1..m-1], B[1..n]) + 1 \\ \text{Edit}(A[1..m], B[1..n-1]) + 1 \\ \text{Edit}(A[1..m-1], B[1..n-1]) + [A[m] \neq B[n]] \end{array} \right\}$$

ALGO
ALT

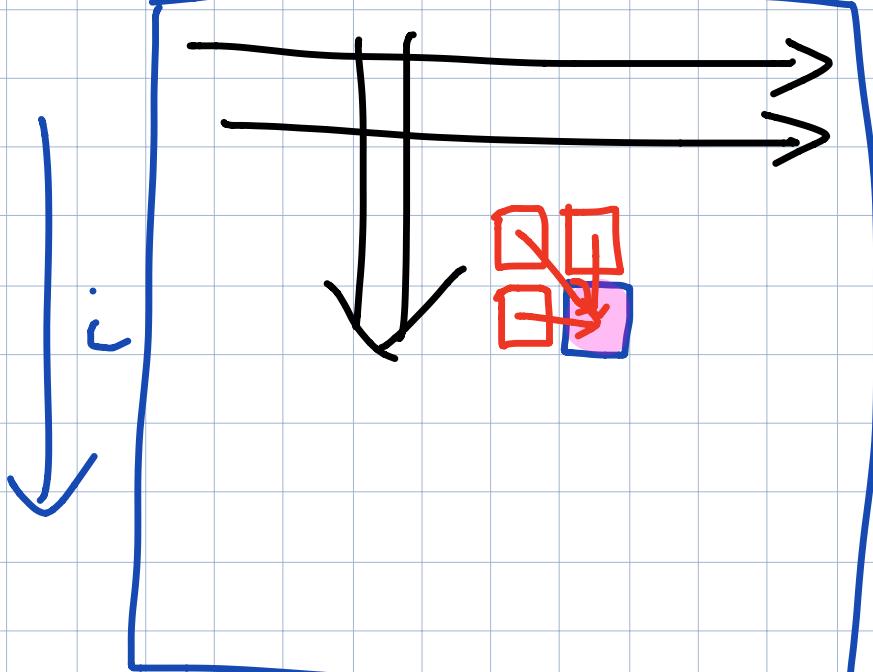
$\text{Edit}(i, j) =$
 Edit distance
 between $A[1 \dots i]$
 and $B[1 \dots j]$

$$\text{Edit}(0, j) = j$$

$$\text{Edit}(i, 0) = i$$

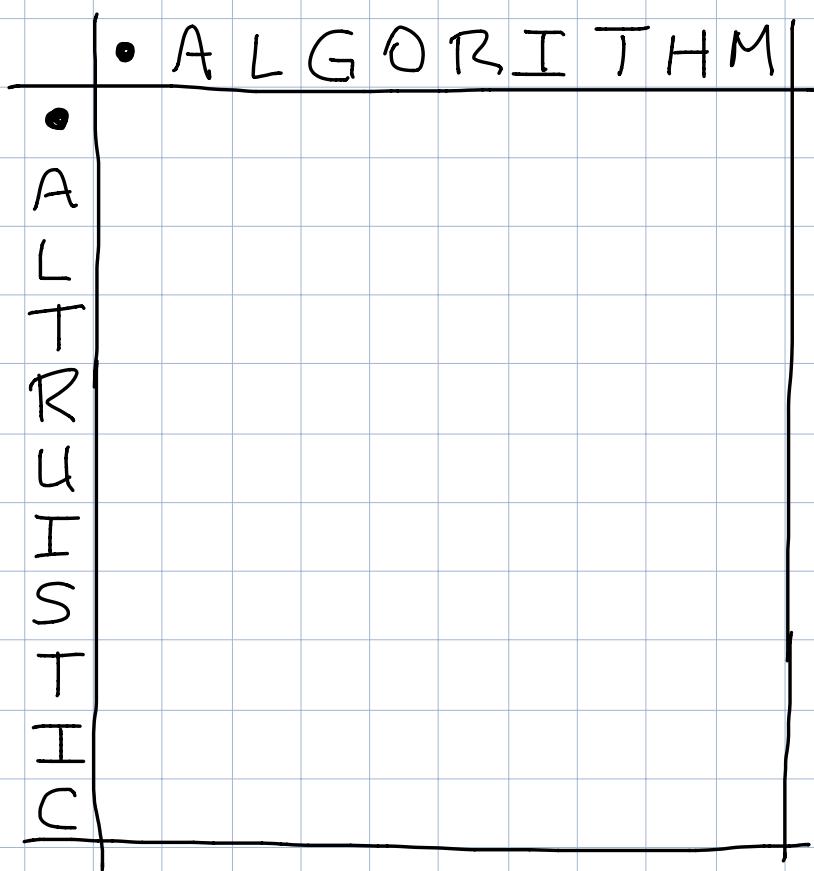
$$\text{Edit}(i, j) = \begin{cases}
 i & \text{if } j = 0 \\
 j & \text{if } i = 0 \\
 \min \left\{ \begin{array}{l} \text{Edit}(i - 1, j) + 1, \\ \text{Edit}(i, j - 1) + 1, \\ \text{Edit}(i - 1, j - 1) + [A[i] \neq B[j]] \end{array} \right\} & \text{otherwise}
 \end{cases}$$

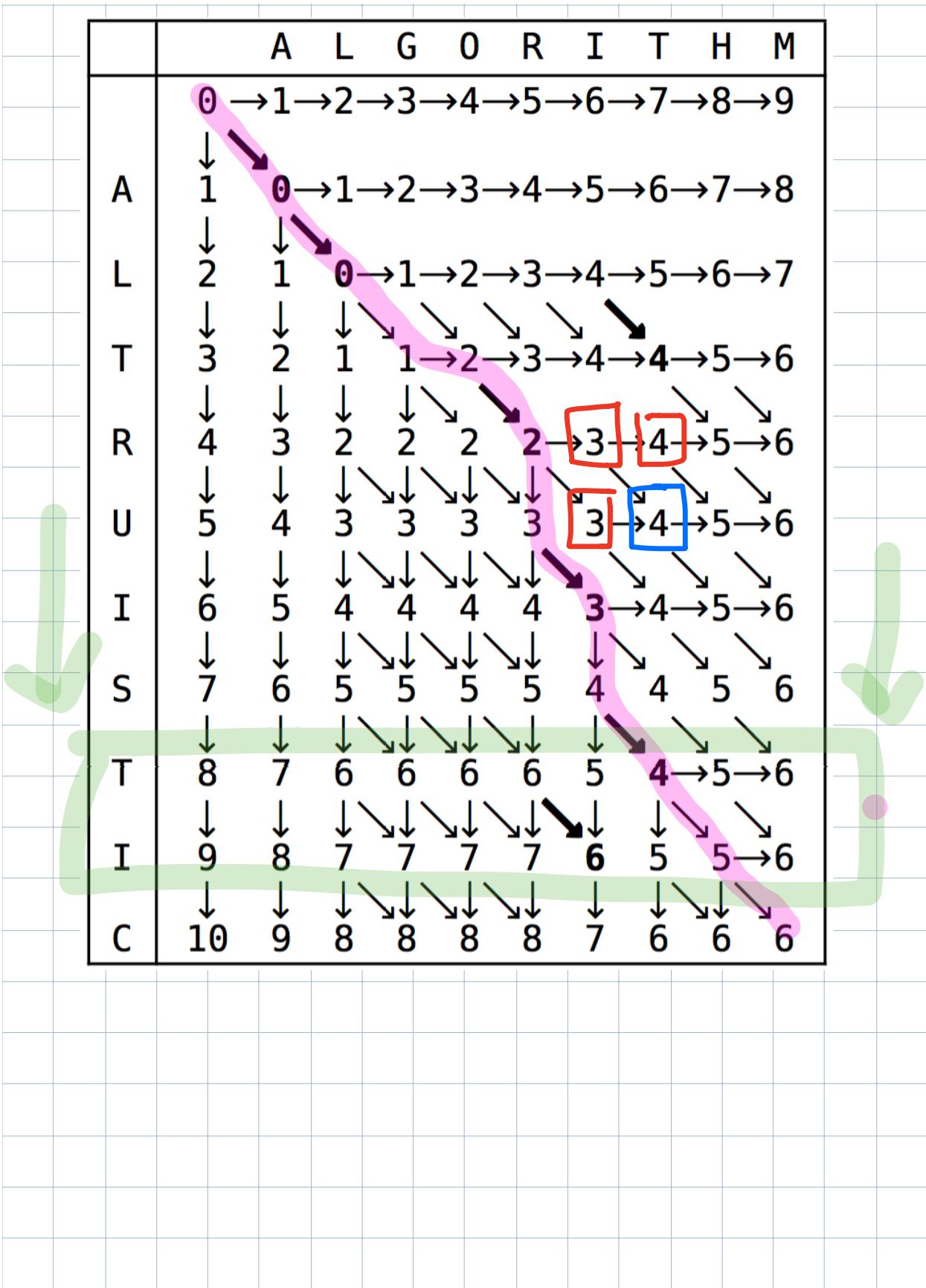
Memoize into 2d array



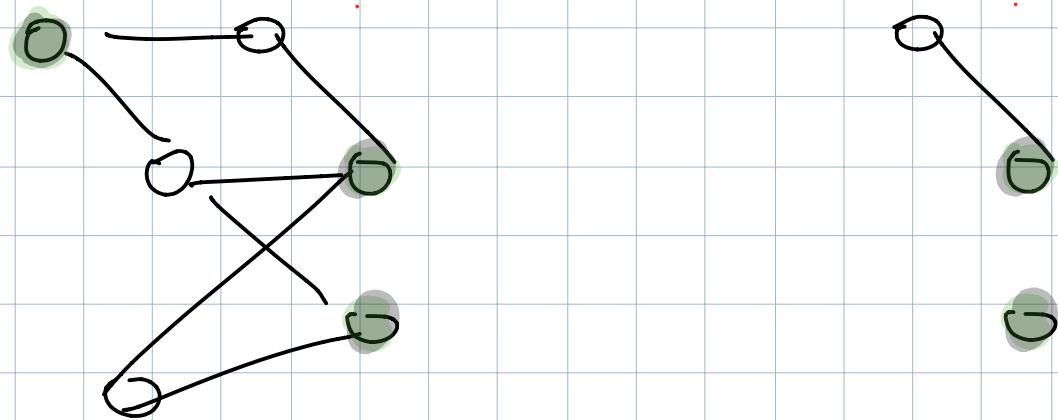
```
EDITDISTANCE( $A[1..m], B[1..n]$ ):  
    for  $j \leftarrow 1$  to  $n$   
         $Edit[0,j] \leftarrow j$   
    for  $i \leftarrow 1$  to  $m$   
         $Edit[i,0] \leftarrow i$   
        for  $j \leftarrow 1$  to  $n$   
            if  $A[i] = B[j]$   
                 $Edit[i,j] \leftarrow \min\{Edit[i-1,j] + 1, Edit[i,j-1] + 1, Edit[i-1,j-1]\}$   
            else  
                 $Edit[i,j] \leftarrow \min\{Edit[i-1,j] + 1, Edit[i,j-1] + 1, Edit[i-1,j-1] + 1\}$   
    return  $Edit[m,n]$ 
```

$O(nm)$ Time





NP-hard!



Max. Indep. Set

MAXIMUMINDSETSIZE(G):

if $G = \emptyset$

 return 0

$v \leftarrow$ any node in G

$withv \leftarrow 1 + \text{MAXIMUMINDSETSIZE}(G \setminus N(v))$

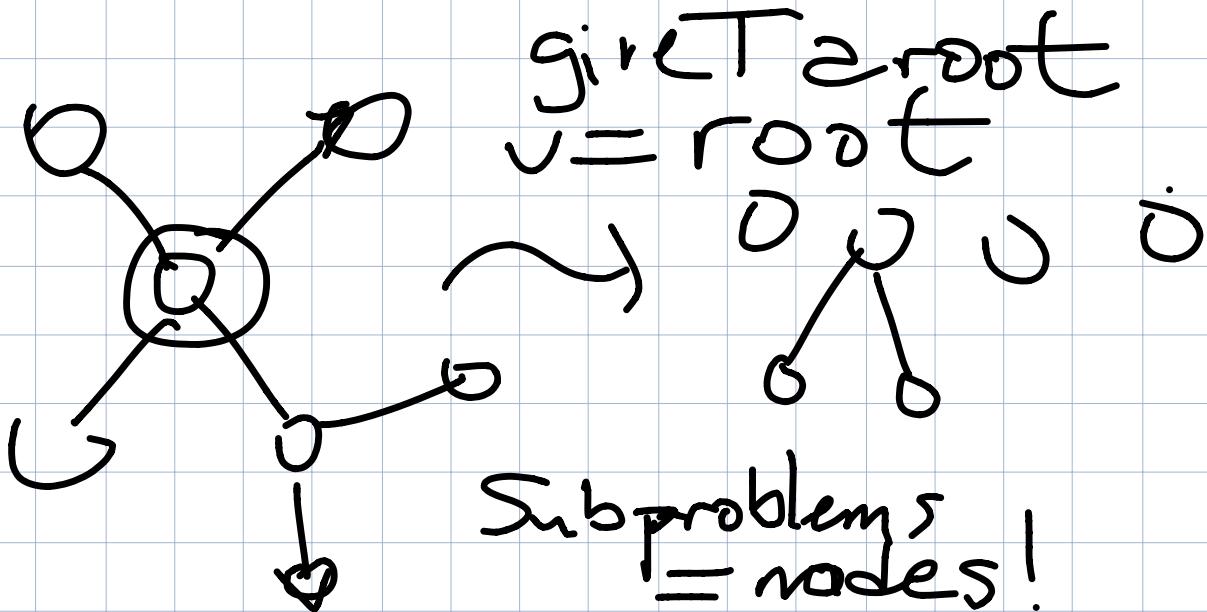
$withoutv \leftarrow \text{MAXIMUMINDSETSIZE}(G \setminus \{v\})$

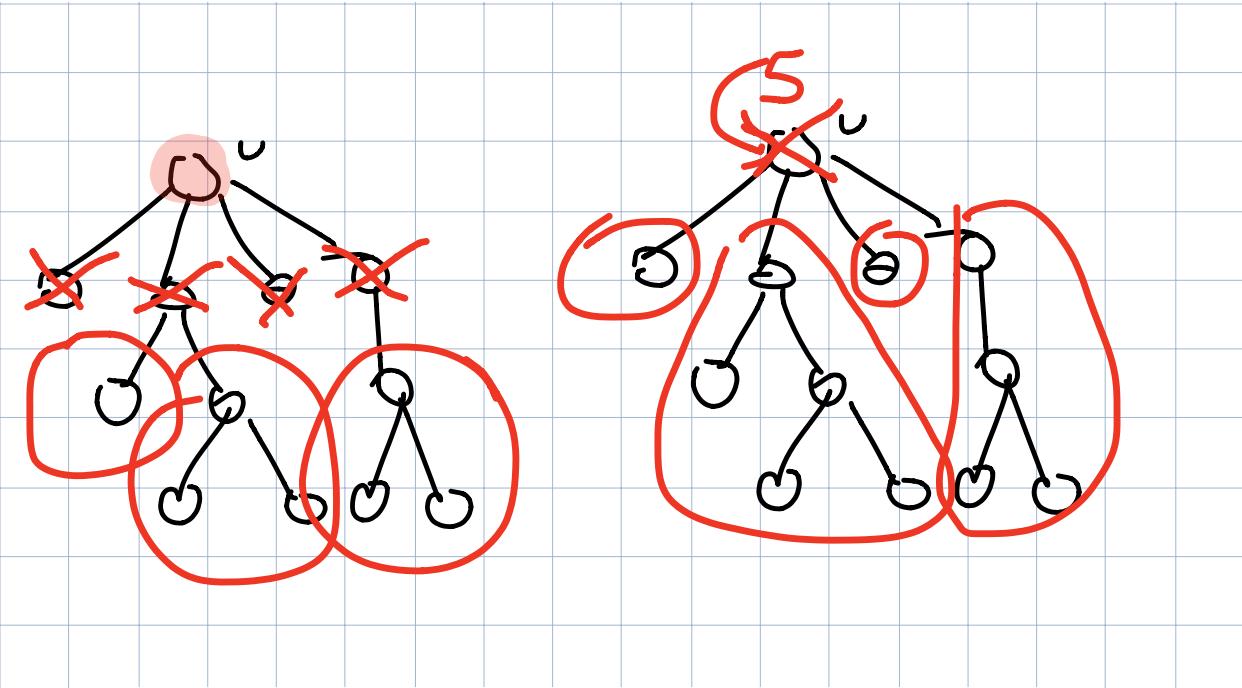
return $\max\{withv, withoutv\}$.

Trees!

MAXIMUMINDSETSIZE(T):

```
if  $T = \emptyset$ 
    return 0
 $v \leftarrow$  any node in  $T$ 
 $withv \leftarrow 1$ 
for each tree  $T'$  in  $T \setminus N(v)$ 
     $withv \leftarrow withv + \text{MAXIMUMINDSETSIZE}(T')$ 
 $withoutv \leftarrow 0$ 
for each tree  $T'$  in  $T \setminus \{v\}$ 
     $withoutv \leftarrow withoutv + \text{MAXIMUMINDSETSIZE}(T')$ 
return  $\max\{withv, withoutv\}.$ 
```





MAXIMUMINDSETSIZE(v):

$withv \leftarrow 1$

 for each grandchild x of v

$withv \leftarrow withv + \text{MAXIMUMINDSETSIZE}(x)$

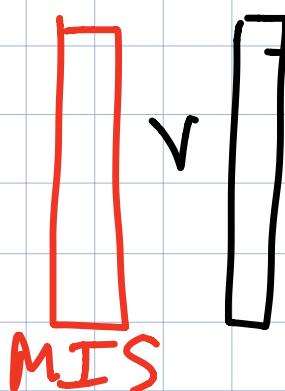
$withoutv \leftarrow 0$

 for each child w of v

$withoutv \leftarrow withoutv + \text{MAXIMUMINDSETSIZE}(w)$

return $\max\{withv, withoutv\}$.

Data structure?



whatever
T is!

ORDER? Post! DFS
 Dependencies?



MAXIMUMINDSETSIZE(v):

```

 $withoutv \leftarrow 0$ 
for each child  $w$  of  $v$ 
     $withoutv \leftarrow withoutv + \text{MAXIMUMINDSETSIZE}(w)$ 
 $withv \leftarrow 1$ 
for each grandchild  $x$  of  $v$ 
     $withv \leftarrow withv + x.\text{MIS}$ 
 $v.\text{MIS} \leftarrow \max\{withv, withoutv\}$ 
return  $v.\text{MIS}$ 

```

O(n)

for all v in postorder
 [eval MIS(v)]

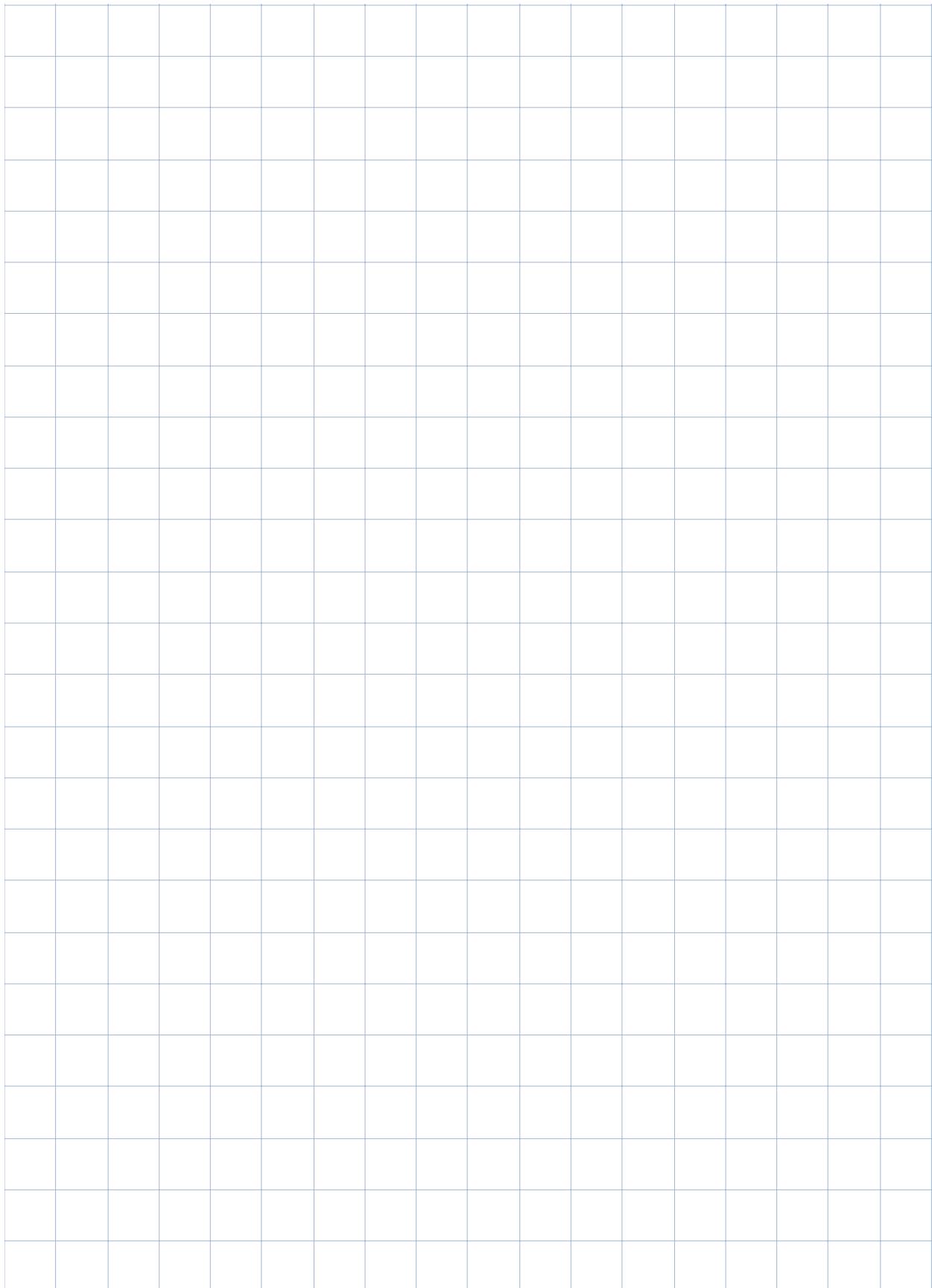
MAXIMUMINDSETSIZE(v):

```

 $v.\text{MISno} \leftarrow 0$ 
 $v.\text{MISyes} \leftarrow 1$ 
for each child  $w$  of  $v$ 
     $v.\text{MISno} \leftarrow v.\text{MISno} + \text{MAXIMUMINDSETSIZE}(w)$ 
     $v.\text{MISyes} \leftarrow v.\text{MISyes} + w.\text{MISno}$ 
return  $\max\{v.\text{MISyes}, v.\text{MISno}\}$ 

```

O(n)



LONGESTPATH(v, t):

```
if  $v = t$ 
    return 0
if  $v.LLP$  is undefined
     $v.LLP \leftarrow \infty$ 
    for each edge  $v \rightarrow w$ 
         $v.LLP \leftarrow \max \{v.LLP, \ell(v \rightarrow w) + \text{LONGESTPATH}(w, t)\}$ 
return  $v.LLP$ 
```

LONGESTPATH(s, t):

```
for each node  $v$  in reverse topological order
    if  $v = t$ 
         $v.LLP \leftarrow \infty$ 
    else
         $v.LLP \leftarrow \infty$ 
        for each edge  $v \rightarrow w$ 
             $v.LLP \leftarrow \max \{v.LLP, \ell(v \rightarrow w) + w.LLP\}$ 
return  $s.LLP$ 
```