

# Algorithms - Spring '25

Induction

Pseudocode

Runtime



# Recap

- Recding due by 8am, every day we have class
  - ↳ no excuses, but I'll drop lowest 3 to allow for illness / forgetting / travel
- HW O: due next Wed
- No class or office hour Monday
- Extra office hour on Tuesday from 3-Spm

Last time:

- Big - O
- Identities & Summations
- Induction

④

## Induction

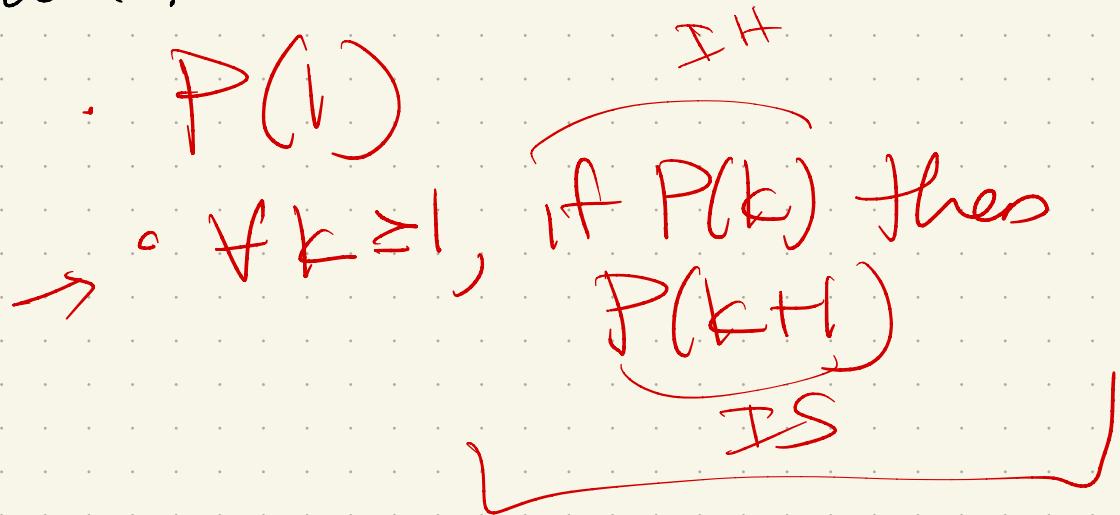
There is a template!

Base case: Prove statement for small value

Ind hypothesis: Assume true for values  $\leq k$

Ind. step: Prove true for next value  $k+1$

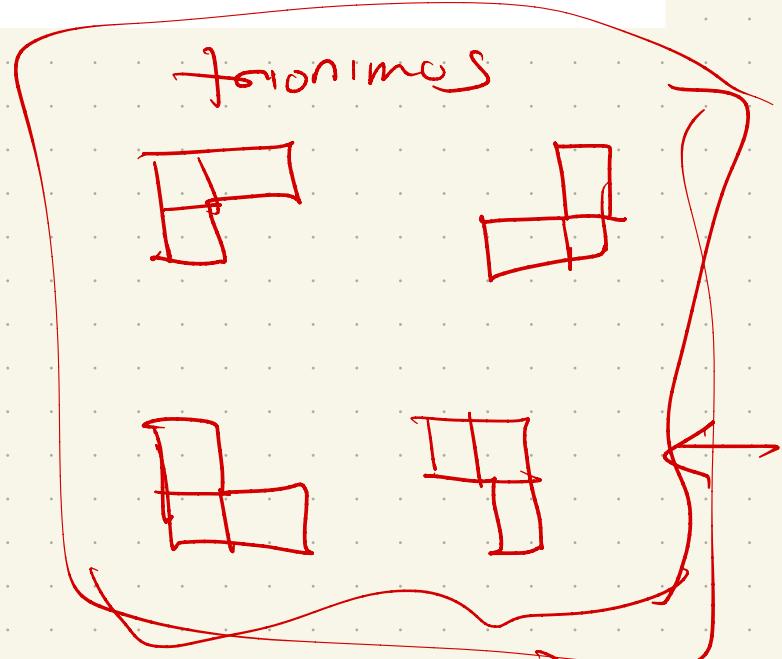
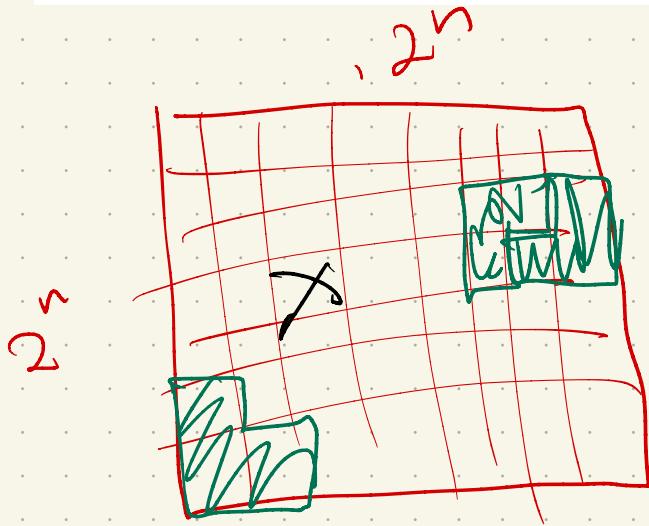
Think of this as "automating" a proof.



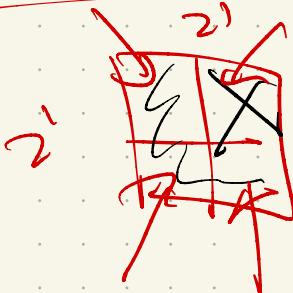
Learn it, use it, love it!

# "Structural" induction:

Let  $n$  be a positive integer. Show that every  $2^n \times 2^n$  checkerboard with one square removed can be tiled using right triominoes, where these pieces cover three squares at a time, as shown in Figure 4.

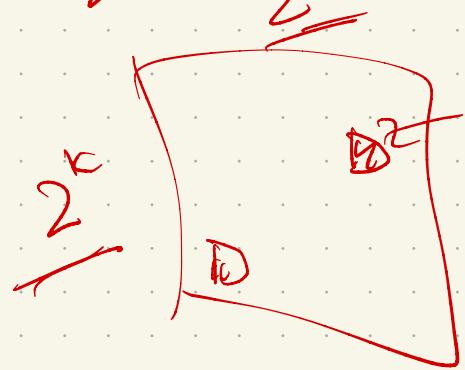


Base case:  $2^1 \times 2^1$  board

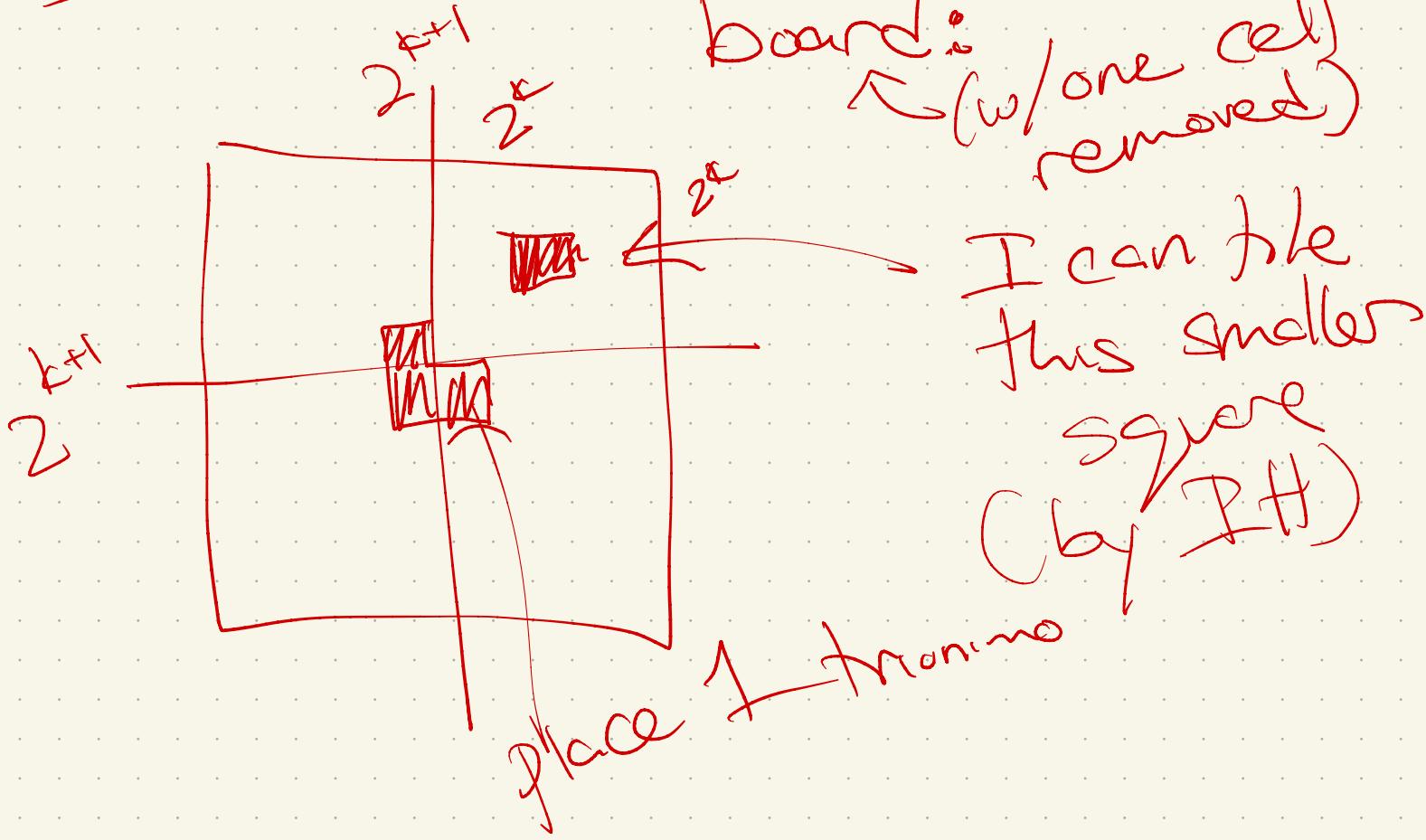


No matter which square is removed  
I can cover the other 3

IH: Assume I can tile  
any  $2^k \times 2^k$  board with  
any 1 square removed



IS: Show I can do a  $2^{k+1} \times 2^{k+1}$

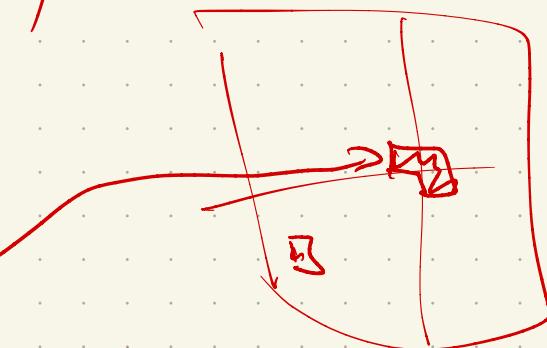


Cut  $2^{k+1} \times 2^{k+1}$  board into  
4 smaller ones, each  $2^k \times 2^k$ .

One of them is missing a  
cell. The other 3 share  
a common center which can  
be covered by a domino.

Remove those 3

center cells

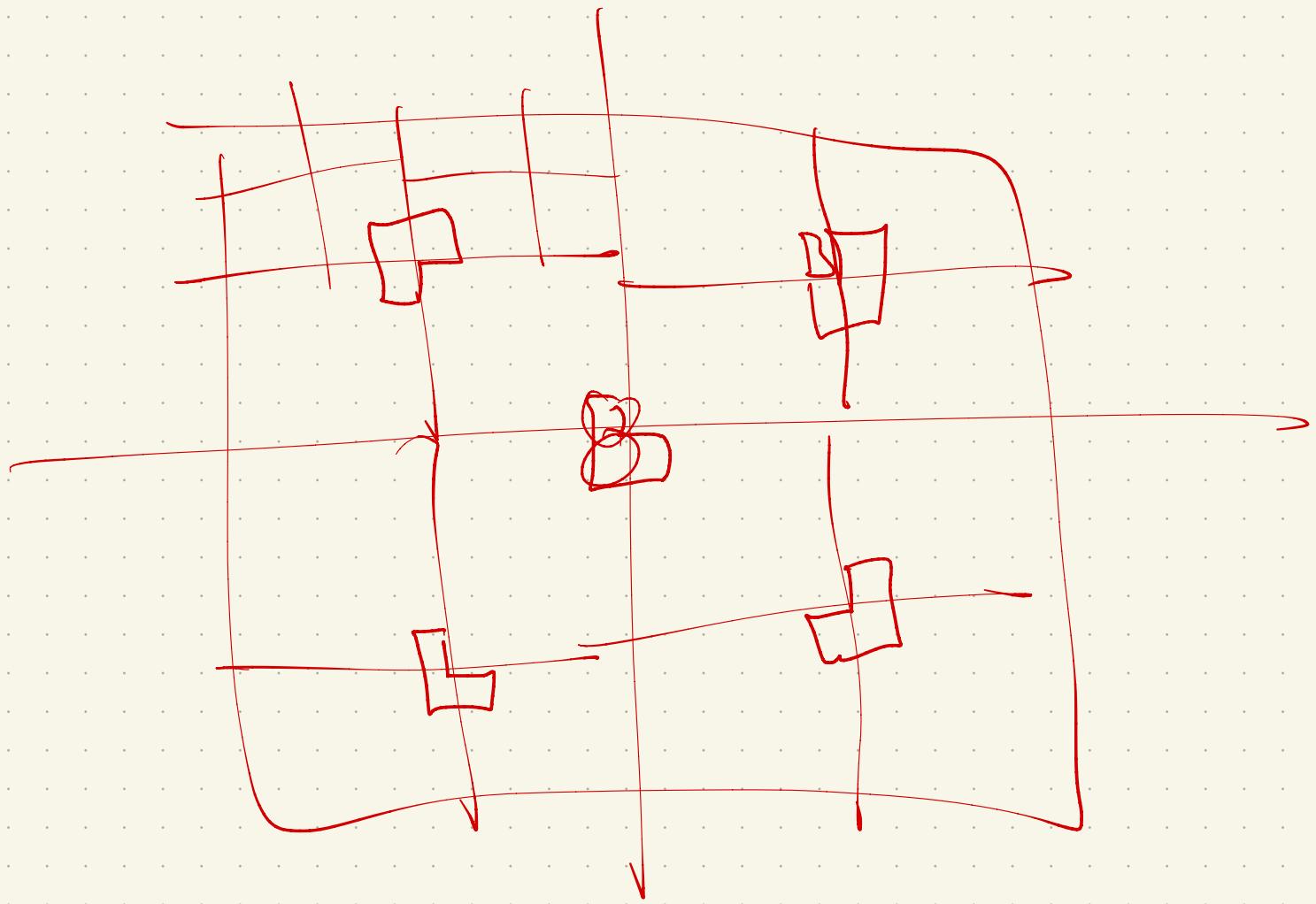


Now have 4  $2^k \times 2^k$  boards,  
each missing a square

↪ tile by IH.

⇒ Tile the larger board:  
use the IH 4 solution  
plus center domino.

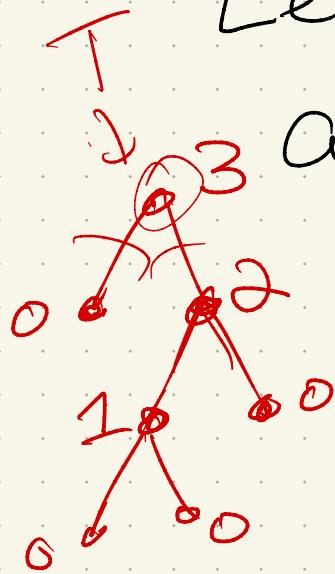




$$A(n) = 4A\left(\frac{n}{4}\right) + 1$$

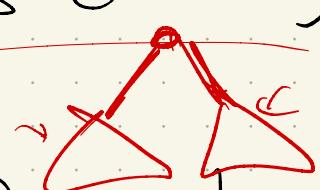
## Induction on graphs/tree

Let  $h(T)$  = height of  
a full binary tree



every node has 0 or  
2 children

$$h(T) = \begin{cases} 0 & \text{if } T \text{ is a single node} \\ 1 + \max(h(T_i^{\text{root}} \text{ children})) & \text{otherwise} \end{cases}$$



Claim: The number of nodes

in a full binary tree is

$$\leq 2^{h(T)} + 1$$

$$n \leq 2^n + 1 \Rightarrow h = O(\log n)$$

Claim: The number of nodes  
in a full binary tree is

$$\leq 2^{h(T)}$$

$$+ 1$$

~~must be~~  
should  
be -1

Proof: Induction on size of  
tree,  $n$

Base case:  $n=1$

height = 0 (by defn)

and  $2^0 + 1 = 2$

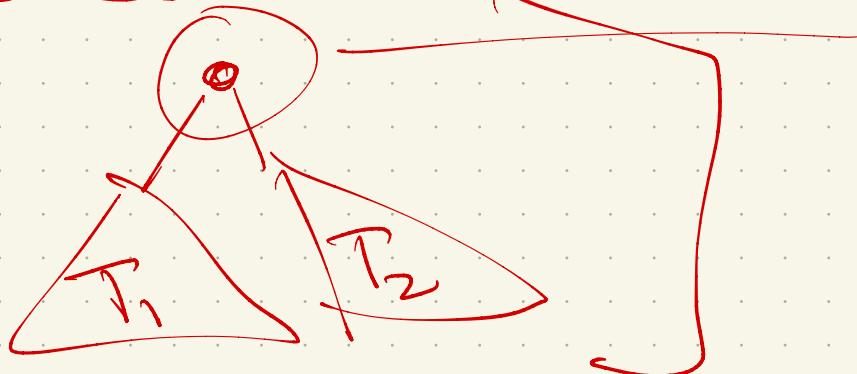
$$n \rightarrow 1 \leq 2 \sim 2^0 + 1$$

IH: If we have  $\leq k \leq n$   
vertices, then

$$k \leq 2^{h(T)} + 1$$

Ind step:

Consider  $n$  nodes:



$$h(T) = \max \{ h(T_1), h(T_2) \} + 1$$

$n$  nodes  $\leq$  root  
2 subtrees  $T_1 \& T_2$

$$\frac{\# \text{ nodes in } T_1 \leq n}{\# \text{ nodes in } T_2 \leq n}$$

Use IH:

$$\# \text{ nodes in } T_1 \leq 2^{h(T_1)} + 1$$

$$\# \text{ nodes in } T_2 \leq 2^{h(T_2)} + 1$$

$$n = 1 + (\text{nodes in } T_1)$$

$$+ (\text{nodes in } T_2)$$

$$\leq 1 + \underbrace{(2^{h(T_1)} + 1)}$$

$$+ \underbrace{(2^{h(T_2)} + 1)}$$

$$\leq 1 + 2^{\max\{h(T_1), h(T_2)\}} + 1$$

$$\geq 1 + 2^{\max\{h(T_1), h(T_2)\}} + 1$$

$$\geq 3 + 2^{h(T)}$$

Stay tuned...

$$2^{h(T)} - 1$$



# 3 Pseudo code & runtime: Discrete math examples (from Rosen textbook)

## ALGORITHM 1 Finding the Maximum Element in a Finite Sequence.

```
procedure max( $a_1, a_2, \dots, a_n$ : integers)
max :=  $a_1$ 
for  $i := 2$  to  $n$ 
    if  $max < a_i$  then  $max := a_i$ 
return max {max is the largest element}
```

→ variable assignment

↳ Pascal-like

## ALGORITHM 2 The Linear Search Algorithm.

```
procedure linear search( $x$ : integer,  $a_1, a_2, \dots, a_n$ : distinct integers)
 $i := 1$ 
while ( $i \leq n$  and  $x \neq a_i$ )
    →  $i := i + 1$ 
if  $i \leq n$  then  $location := i$ 
else  $location := 0$ 
return location {location is the subscript of the term that equals  $x$ , or is 0 if  $x$  is not found}
```

Pseudocode conventions here:

Variable assignment:  $x \leftarrow 2$   
T arrow  
C arrow

Boolean comparison:

$\text{if } (x = 5)$

T or F

Arrays:  $A[0..n-1]$   
- each  $A[i]$ ,  
value of a set type (same for array)  
 $n$  is size of array

Loops:  $\text{for } i \leftarrow 1 \text{ to } 100$   
 $A[i] \leftarrow i$

Assume "basic data structures"

Again, takes practice! Read  
intro chapter + the give  
HW0/HW1 atry.

# Pseudocode format:

In a pinch, pretend you're in Python/Ruby.

High level & readable.

I realize this is not a "definition" -  
that is the point!

It's about effective communication.

Initially:

- lots of examples
- lots of practice
- reach out if you have questions
- in a pinch - peer evaluation!

Example (& tie to runtimes):

Multiplication:

Input: 2 numbers

$\nwarrow$  m digit

$\nwarrow$  in decimal

$$X[0..m-1], Y[0..n-1] \swarrow n \text{ digit}$$

$$\leftarrow + X = \sum_{i=0}^{m-1} X[i] \cdot 10^i, Y = \sum_{j=0}^{n-1} Y[j] \cdot 10^j$$

Example:  $X = \underline{\underline{2}} \underline{\underline{5}} \underline{\underline{9}} \underline{\underline{6}} \underline{\underline{8}}$

$$Y = 1365$$

$$\hookrightarrow X = 8 \cdot 10^0 + 6 \cdot 10^1 + 9 \cdot 10^2 + 5 \cdot 10^3 + 2 \cdot 10^4$$

$$X[0..4] = [8, 6, 9, 5, 2]$$

Back to grade school:

$$\begin{array}{r} 4 \quad 3 \quad 4 \quad 4 \\ \times 2 \quad 5 \quad 9 \quad 6 \quad 8 \\ \hline \end{array}$$

The multiplication is shown with red annotations:

- The top number is 4344.
- The bottom number is 25968.
- The result of the multiplication is 1365.
- The partial products are circled in red: 890 (from 4344 \* 8), 000 (from 4344 \* 6), and 0000 (from 4344 \* 2).
- Red lines connect the digits of the top number to the digits of the bottom number to show the placement of each digit in the product.

Abstract:

Find all digits:

+ how many powers of  
10 they get:

$$X \cdot Y = \sum_{i=0}^{m-1} \sum_{j=0}^{n-1}$$

Another view: Instead of just adding all, search for all that land in one spot k:

FIBONACCI MULTIPLY( $X[0..m-1], Y[0..n-1]$ ):

$hold \leftarrow 0$

for  $k \leftarrow 0$  to  $n+m-1$

    for all  $i$  and  $j$  such that  $i+j = k$

$hold \leftarrow hold + X[i] \cdot Y[j]$

$Z[k] \leftarrow hold \bmod 10$

$hold \leftarrow \lfloor hold/10 \rfloor$

return  $Z[0..m+n-1]$



Space & runtime:

# More Complex: recursion!

## Algorithm 1 Quicksort

```
1: procedure QUICKSORT( $A, p, r$ )
2:   if  $p < r$  then
3:      $q = \text{PARTITION}(A, p, r)$ 
4:     QUICKSORT( $A, p, q - 1$ )
5:     QUICKSORT( $A, q + 1, r$ )
6:   end if
7: end procedure
8: procedure PARTITION( $A, p, r$ )
9:    $x = A[r]$ 
10:   $i = p - 1$ 
11:  for  $j = p$  to  $r - 1$  do
12:    if  $A[j] < x$  then
13:       $i = i + 1$ 
14:      exchange  $A[i]$  with  $A[j]$ 
15:    end if
16:    exchange  $A[i]$  with  $A[r]$ 
17:  end for
18: end procedure
```

## QuickSort Pseudocode Example

Any function  
which calls  
itself  
(on a smaller  
size)

# Multiplication: How?

$$x \cdot y = \begin{cases} 0 & \text{if } x = 0 \\ \lfloor x/2 \rfloor \cdot (y + y) & \text{if } x \text{ is even} \\ \lfloor x/2 \rfloor \cdot (y + y) + y & \text{if } x \text{ is odd} \end{cases}$$

Why? Proof by cases:  
If  $x$  is even:

If  $x$  is odd:

Note: historical name! Not a comment...  
•

### PEASANTMULTIPLY( $x, y$ ):

if  $x = 0$

    return 0

else

$x' \leftarrow \lfloor x/2 \rfloor$

$y' \leftarrow y + y$

$prod \leftarrow \text{PEASANTMULTIPLY}(x', y')$     «Recurse!»

    if  $x$  is odd

$prod \leftarrow prod + y$

    return  $prod$

Runtime :

Correctness

# Recursive Algorithms : Chapter 1

## 1<sup>st</sup> half:

Setup, plus (hopefully)  
familiar examples:

- Towers of Hanoi
- Merge Sort

## 2<sup>nd</sup> half:

- Recap of recurrences  
& "Master theorem"
- Linear time Selection
- Multiplication (again)
- Exponentiation