

# CS3102 Theory of Computation

$$f: \{0, 1\} \rightarrow \{0, 1\}$$

NCAA men's basketball · Today, 9:00 PM



Notre Dame Fighting Irish  
(15-8)

at



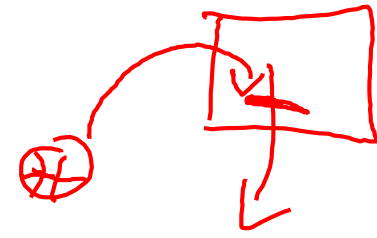
Virginia Cavaliers  
(15-7)

Warm up:

Is this function computable with a NAND-Circuit?

$$f(a) = \begin{cases} 1 \\ 0 \end{cases}$$

if UVA wins against ND tonight  
otherwise



UVA wins:  $\neg \text{NAND}(a, \neg a)$

ND wins:  $\neg \text{NAND}(a, \neg a)$

# Logistics

- Quiz 3 out
  - Due Thursday
- Exercise 3 is out
  - Last exercise before midterm

# Last Time

- Showing that NAND/AON can compute any finite function
- Started showing how we could have a function that simulates programs

program      input

# How are programs run?

- Have a table of variables
- Execute code in sequence
- Update values in table
- Return a value from the table

variables	value
a	0
b	1
c	0
...	
...	
Return	0

Eval <sup>output</sup>  
↑  
n, m, s  
↑  
input lines

NAND-Straightline

# Programs as Bits

- To evaluate a program with another program, we need to convert the first program into bits

- 1. Number each variable (first  $n$  go to input, last  $m$  to outputs)
2. Represent each line as 3 numbers (outvar, in1, in2) ←
3. Represent program as  $(n, m, [\text{Lines}])$  ↘

0 1

```
def OR(a, b):  
    → temp1 = NAND(a, a) → (2, 0, 0)  
    3 temp2 = NAND(b, b) → (3, 1, 1)  
    ↙ return NAND(temp1, temp2) (4, 2, 3)
```

(2, 1, [(2, 0, 0), (3, 1, 1), (4, 2, 3)])

Variable	Number
a →	0
b →	1
temp1 →	2
temp2 →	3
return →	4

# XOR to bits $|\{0, 1\}^x| = 2^x$

```
def XOR(a,b):
    u = NAND(a,b) [2, 0, 1]
    v = NAND(a, u) [3, 0, 2]
    w = NAND(b, u) [4, 1, 2]
    return NAND(v,w) [5, 3, 4]
```

$\leftarrow$  return

n = 2

m = 1

s = 4

Total bits =  $2 + 1 + 3 \cdot 5 \cdot \lceil \log_2(n+s) \rceil$  ess

Variable	Number
a	0
b	1
u	2
v	3
w	4
Return	5

# XOR to bits

```
def XOR(a,b):  
    u = NAND(a,b)  
    v = NAND(a, u)  
    w = NAND(b, u)  
    return NAND(v,w)
```

$n = 2$

$m = 1$

$s = 4$

Variable	Number
a	0
b	1
u	2
v	3
w	4
return	5

Total bits = 3 [numbers per line] · 3 [bits per number] · 4[lines] + 6 [length of  $n + m$ ]

S

# How big is this?

Number of  
var =  $n + S$

1. Number each variable  $\lceil \log_2 (n+S) \rceil$   
 ~~$\lceil \log_2 3s \rceil$  bits each~~
  2. Represent each line as 3 numbers (outvar, in1, in2)
  3. Represent program as  $(n, m, \underbrace{[Lines]}_{2\lceil \log_2 s \rceil \text{ bits}})$   $3s \cdot \lceil \log_2 3s \rceil$  bits
- $S(s) = \text{size of the program of } s \text{ lines in } 6 \cdot 4s$   
 $S(s) \leq \underline{4s \lceil \log_2 3s \rceil}$   $3 \cdot s \cdot \text{Length}(\text{var})$   
 $\ell = \lceil \log_2 3s \rceil$   $4 \cdot s \cdot \log s$



# Defining EVAL

$$EVAL_{s,n,m}: \{0,1\}^{\overbrace{S(s)+n}^{\text{program input}}} \rightarrow \{0,1\}^{\overbrace{m}^{\text{outputs}}}$$

*Handwritten annotations:*  
-  $4 \log s$  above  $S(s)$   
-  $S(s)$  is boxed and labeled "program"  
-  $+n$  is labeled "input"  
-  $m$  is labeled "outputs"

Input: bit string representing a program (first  $S(s)$  bits) plus input values (remaining  $n$  bits)

Output: the result of running the represented program on the provided input, or  $m$  0's if there's a "compile error"

# Defining the EVAL function

$$\frac{n = 2}{m = 1}$$

Representation: *XOR*

*(2, 0, 1),*  
*(3, 0, 2),*  
*(4, 1, 2),*  
*(5, 3, 4)*

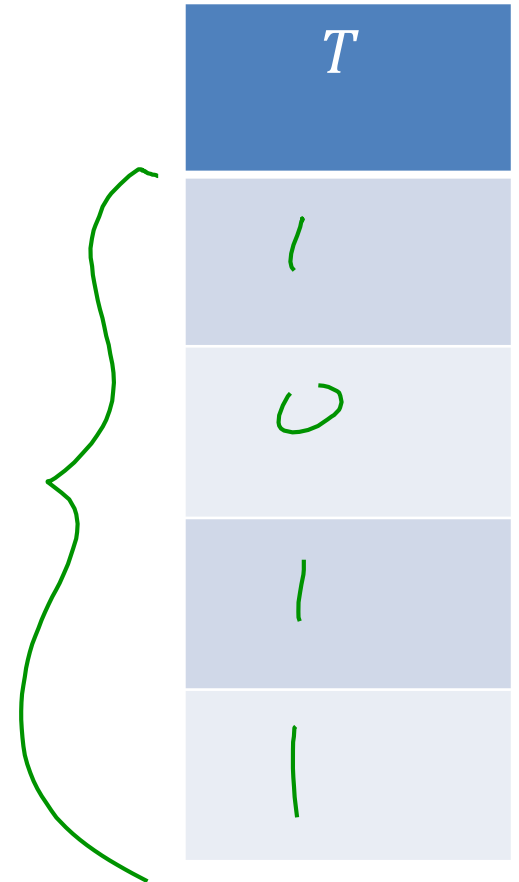
Input:

*→ 0, 1*

Variable	Value
0	<i>0</i>
1	<i>1</i>
2	<i>1</i>
3	<i>1</i>
<i>4</i>	<i>0</i>
<i>5</i>	<i>1</i>

# Pseudocode for EVAL

- Table  $T$ :
  - holds variables and their values
- $GET(T, i)$ 
  - Returns the bit of  $T$  associated with variable  $i$
- $UPDATE(T, i, b)$ 
  - Returns a new table such that variable  $i$ 's value has been changed to  $b$



$T$
1
0
1
1

# Pseudocode for EVAL

- Input:

- Numbers  $n, m, s, t$   
representing the number of  
inputs, outputs, variables,  
and lines respectively
- $L$ , a list of triples  
representing the program
- A string  $x$  to be given as input  
to the program

- Output:

- Evaluation of the program  
represented by  $L$  when run  
on input  $x$

Let  $T$  be table of size  $t$   
For  $i$  in range( $n$ ):  
     $T = \text{UPDATE}(T, i, x[i])$   
For  $(i, j, k)$  in  $L$ :  
     $a = \text{GET}(T, j)$   
     $b = \text{GET}(T, k)$   
     $T = \text{UPDATE}(T, i, \text{NAND}(a, b))$   
For  $i$  in range( $m$ ):  
     $Y[i] = \text{GET}(T, t - m + i)$   
Return  $Y$

# EVAL in NAND

- Next we implement  $EVAL_{s,n,m}$  using NAND

→ GET( $T, i$ )  $l = \text{length of each variable}$

- Get the bit at “row”  $i$  of  $T$

→ Look familiar?  $\text{lookup}(T, i)$

- How many gates to implement?  $\sim 2^l$

look up  $P_\pi$

# UPDATE

$$UPDATE_\ell: \{0,1\}^{2^\ell + \ell + 1} \rightarrow \{0,1\}^{2^\ell}$$

- To change index  $i$  of table  $T$  to bit  $\boxed{b}$
- For every index except  $i$ , return the same value
- For index  $i$ , return  $b$  instead
- Define  $EQUAL_j$ :  $\{0,1\}^\ell \rightarrow \{0,1\}$  which returns 1 if the input binary number is equal to  $j$

Note:  $EQUAL_j$  can be done in  $c \cdot \ell$  gates

# UPDATE pseudocode

For  $j$  in range( $2^\ell$ ):

$a = \text{EQUALS}_{\underline{j}}(i)$

$\text{newT}[j] = \text{IF}(a, b, \text{T}[j])$

Return  $\text{newT}$

Runs  $2^\ell$  times

GET = loop up  
UPDATE =



# Conclusion

- What we know:
  - We can compute any finite function with circuits
  - We can compute a function to evaluate programs of a certain size
- Big question:
  - How expensive are functions? ↩
  - Some are more expensive than others, how big could they get?
  - If I wanted to be able to evaluate a program for any function  $\{0,1\}^n \rightarrow \{0,1\}$ , how big would the eval circuit need to be?

# Complexity

- The "complexity" of a function:
  - Measure of the resources required to compute that function
- Complexity Class:
  - A set of functions defined by a complexity measure

# Categorizing Functions by Circuit Size

- No functions require more than  $cm2^n$  gates
  - Proved last class
- Some functions require much less
  - E.g. IF
- Observation: some functions are more "complicated" than others!
- Idea: categorize functions by resources required to implement them using a particular computing model

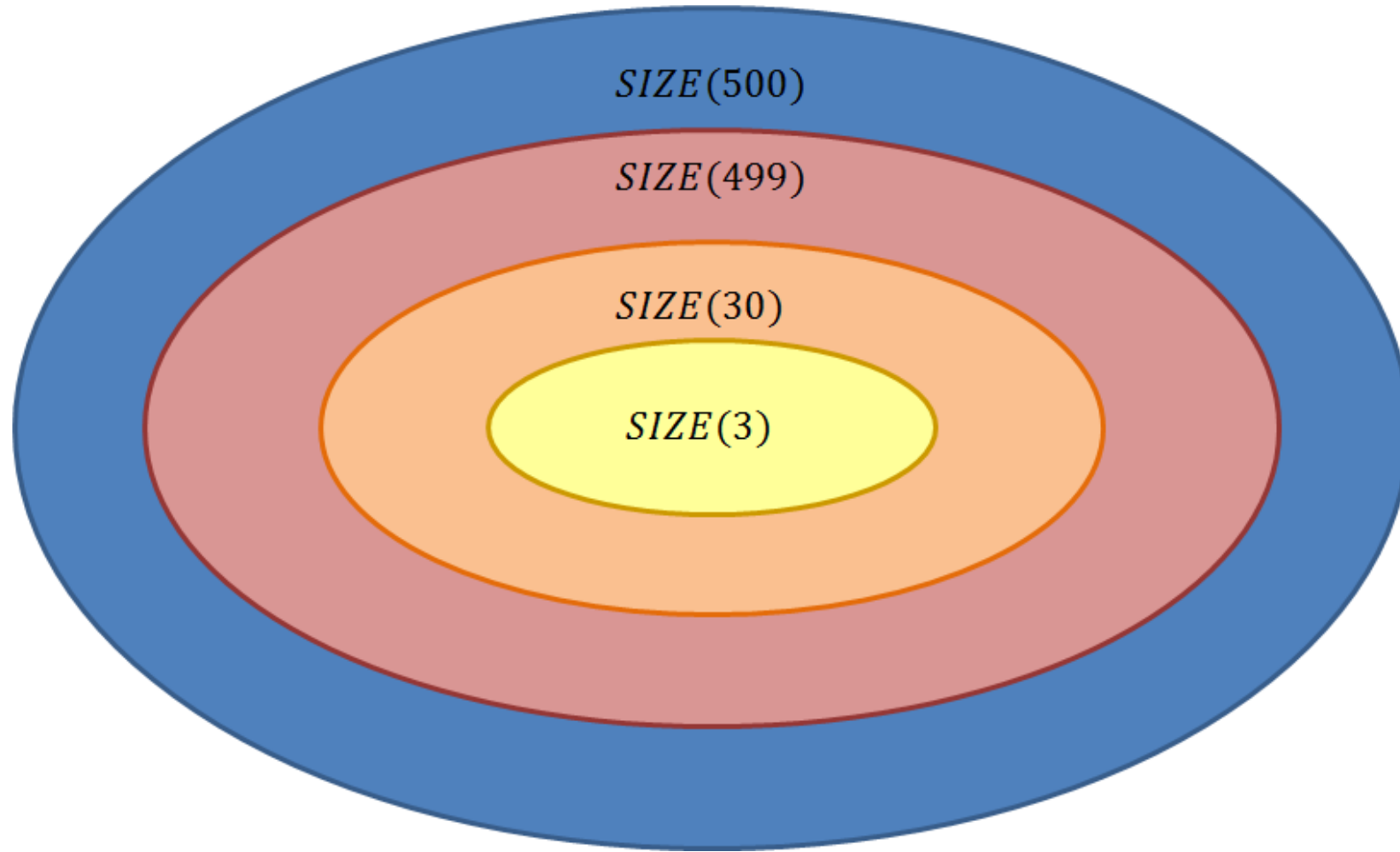
# SIZE

- $SIZE(s)$ : The set of all functions that can be implemented by a circuit of at most  $s$  NAND gates

$SIZE(1000m2^n)$  Contains all functions  $f: \{0,1\}^n \rightarrow \{0,1\}^m$

- TCS also uses:
  - $SIZE_{n,m}(s)$ : The set of all  $n$ -input,  $m$ -output functions that can be implemented with at most  $s$  NAND gates
  - $SIZE_n(s)$ : The set of all  $n$ -input, 1-output functions that can be implemented with at most  $s$  NAND gates

# Comparing Classes



If  $x \leq y$ , then  $SIZE(x) \subseteq SIZE(y)$

# Theorem

- Let  $SIZE^{AON}(s)$  represent the set of all functions that can be computed using at most  $s$  AND/OR/NOT gates

$$SIZE\left(\frac{s}{2}\right) \subseteq SIZE^{AON}(s) \subseteq SIZE(3s)$$

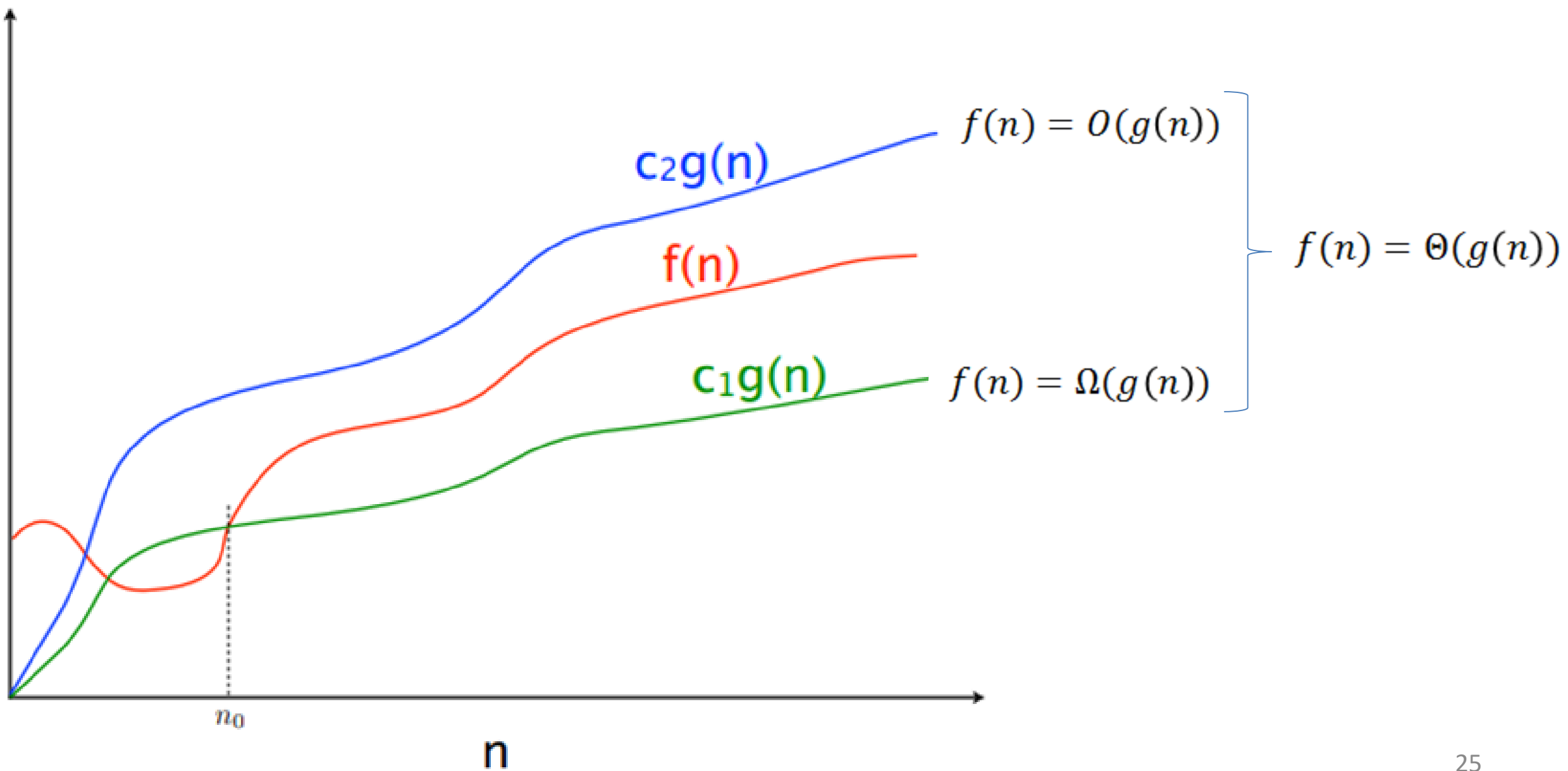
# Proof

$$SIZE\left(\frac{S}{2}\right) \subseteq SIZE^{AON}(s) \subseteq SIZE(3s)$$

# $O, \Omega, \Theta$

- Groups functions together
- Each uses a function as a bound for other functions
- $O$  (Big-Oh):
  - $O(f(n))$  = the set of all functions "asymptotically upper-bounded" by  $f$
- $\Omega$  (Big-Omega):
  - $\Omega(f(n))$  = the set of all functions "asymptotically lower-bounded" by  $f$
- $\Theta$  (Big-Theta):
  - $\Theta(f(n))$  = the set of all functions "asymptotically tight-bounded" by  $f$





# Definitions

- $O(g(n))$ 
  - **At most** within constant of  $g$  for large  $n$
  - $\{f: \mathbb{R} \rightarrow \mathbb{R} \mid \exists \text{ constants } c, n_0 > 0 \text{ s.t. } \forall n > n_0, f(n) \leq c \cdot g(n)\}$
- $\Omega(g(n))$ 
  - **At least** within constant of  $g$  for large  $n$
  - $\{f: \mathbb{R} \rightarrow \mathbb{R} \mid \exists \text{ constants } c, n_0 > 0 \text{ s.t. } \forall n > n_0, f(n) \geq c \cdot g(n)\}$
- $\Theta(g(n))$ 
  - **“Tightly”** within constant of  $g$  for large  $n$
  - $\Omega(g(n)) \cap O(g(n))$

# Showing Big-Oh

- To show:  $n \log n \in O(n^2)$

# Showing Big-Omega

- To Show:  $2^n \in \Omega(n^2)$

# Showing Big-Theta

- To Show:  $\log_x n = \Theta(\log_y n)$