

# Open-Source Operating Systems

Advanced Algorithms

TX00CO27

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# Divide And Conquer



- The divide-and-conquer strategy so successfully used by monarchs and colonizers may also be applied to the development of efficient computer algorithms
  1. *Divide*: Smaller problems are solved recursively (except, of course, base cases)
  2. *Conquer*: The solution to the original problem is then formed from the solutions to the subproblems
- Distinguish between small and large instances
- Small instances solved differently from large ones
- Those smaller instances are often independent, therefore they can be worked on by different processor of the parallel computer

# Small And Large Instance

- Small instance
  - Sort a list that has  $n \leq 10$  elements
  - Find the minimum of  $n \leq 2$  elements
- Large instance
  - Sort a list that has  $n > 10$  elements
  - Find the minimum of  $n > 2$  elements

# Solving A Small Instance

- A small instance is solved using some direct/simple strategy
  - Sort a list that has  $n \leq 10$  elements
    - Use count, insertion, bubble, or selection sort
  - Find the minimum of  $n \leq 2$  elements
    - When  $n = 0$ , there is no minimum element
    - When  $n = 1$ , the single element is the minimum
    - When  $n = 2$ , compare the two elements and determine which is smaller

# Solving A Large Instance

- A large instance is solved as follows:
  - Divide the large instance into  $k \geq 2$  smaller instances
  - Solve the smaller instances somehow
  - Combine the results of the smaller instances to obtain the result for the original large instance

# Sort A Large List

- Sort a list that has  $n > 10$  elements
  - Sort 15 elements by dividing them into 2 smaller lists
    - One list has 7 elements and the other has 8
  - Sort these two lists using the method for small lists
  - Merge the two sorted lists into a single sorted list

# Find The Min Of A Large List

- Find the minimum of 20 elements
  - Divide into two groups of 10 elements each
  - Find the minimum element in each group somehow
  - Compare the minimums of each group to determine the overall minimum

# Recursion In Divide And Conquer

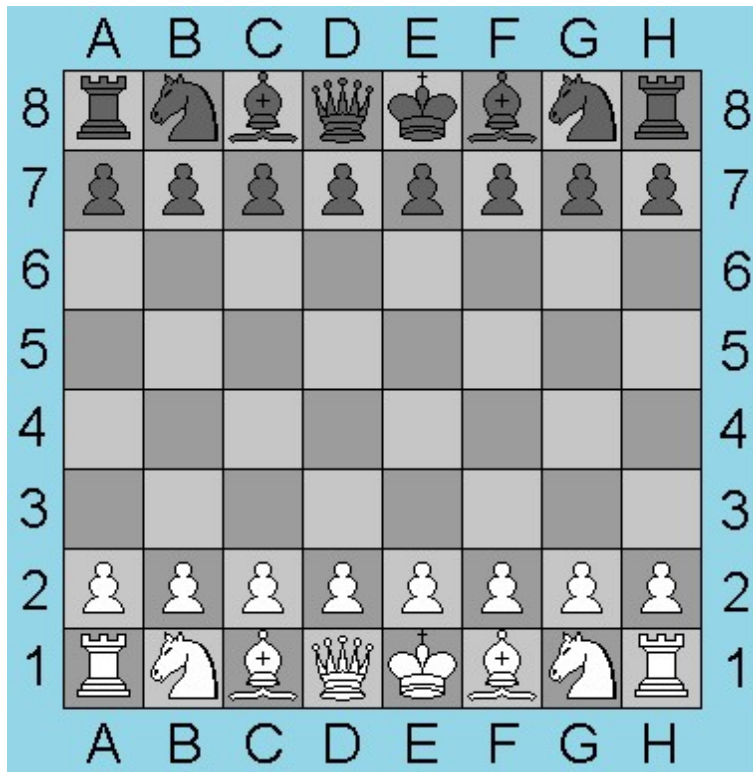
- Often the smaller instances that result from the divide step are instances of the original problem (true for our sort and min problems). In this case,
  - If the new instance is a **small** instance, it is solved using the method for small instances
  - If the new instance is a **large** instance, it is solved using the divide-and-conquer method recursively
- Generally, performance is best when the smaller instances that result from the divide step are of approximately the same size
- For example, nearly all the binary tree algorithms use this technique
  - To traverse a binary tree tree → small instance == NULL; large instance → every non empty binary tree; traversal → NULL → do nothing; non NULL → traverse left, traverse right, visit (say)



# Recursive Find Min

- Find the minimum of 20 elements
  - Divide into two groups of 10 elements each
  - Find the minimum element in each group **recursively**. The recursion terminates when the number of elements is  $\leq 2$ . At this time the minimum is found using the method for small instances
  - Compare the minimums of the two groups to determine the overall minimum

# ♟️ Tiling A Defective Chessboard ♠️



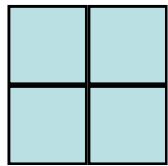
**A real chessboard.**

# Our Definition Of A Chessboard

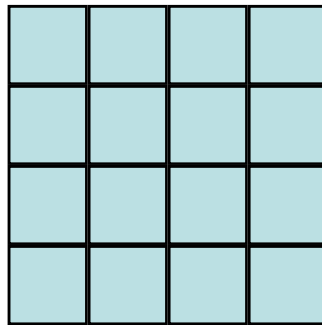
A chessboard is an  $n \times n$  grid, where  $n$  is a power of 2.



1x1

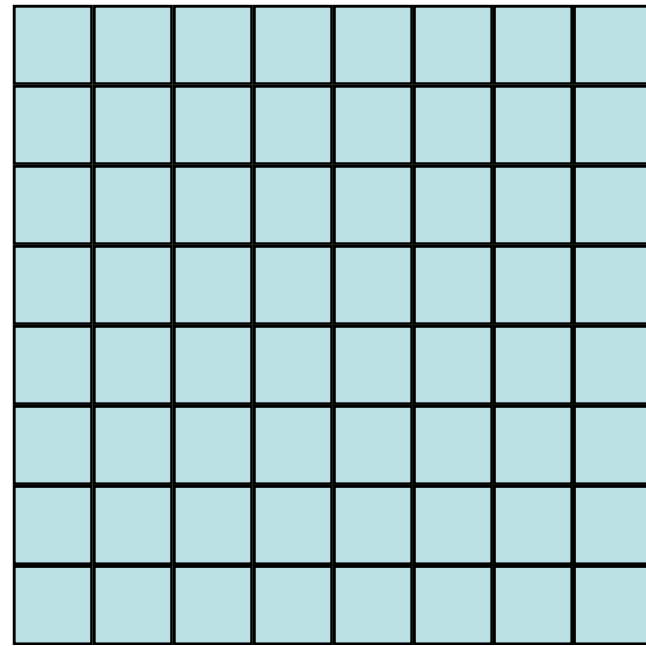


2x2



4x4

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8x8



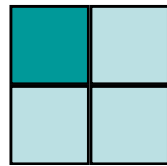
# A Defective Chessboard



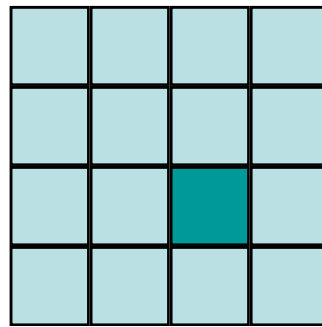
A defective chessboard is a chessboard that has one unavailable (defective) position



1x1

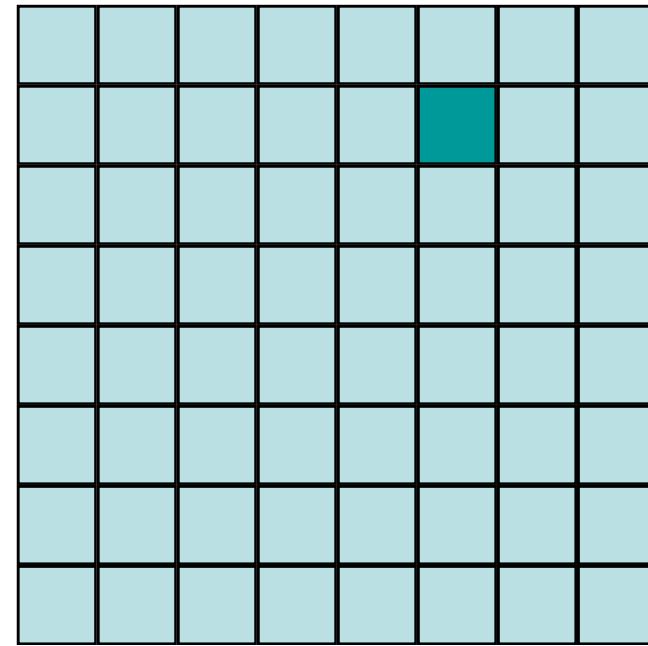


2x2



4x4

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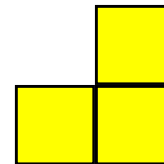
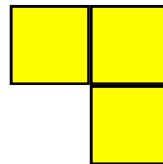
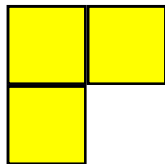
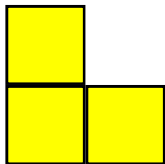


8x8

# A Triomino

A triomino is an L shaped object that can cover three squares of a chessboard

A triomino has four orientations

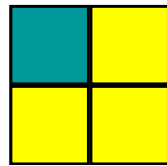


# Tiling A Defective Chessboard

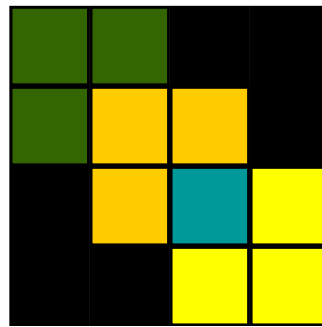
Place  $(n^2 - 1)/3$  triominoes on an  $n \times n$  defective chessboard so that all  $n^2 - 1$  nondefective positions are covered



1x1

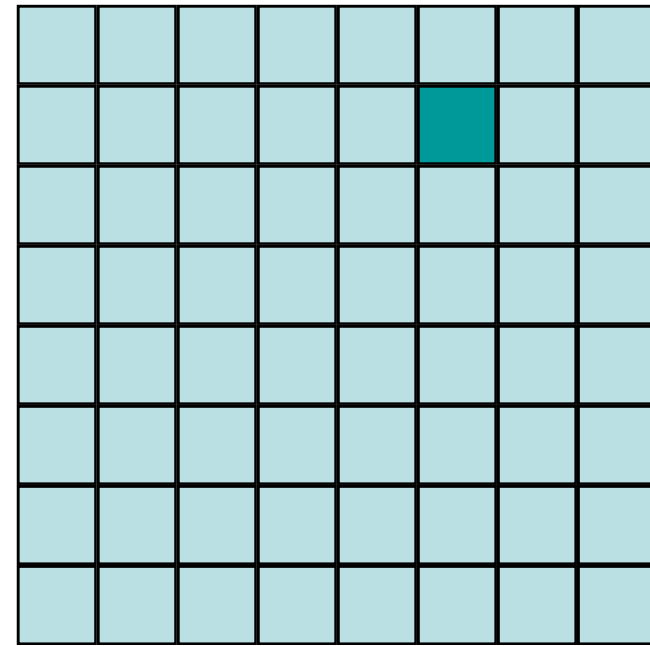


2x2



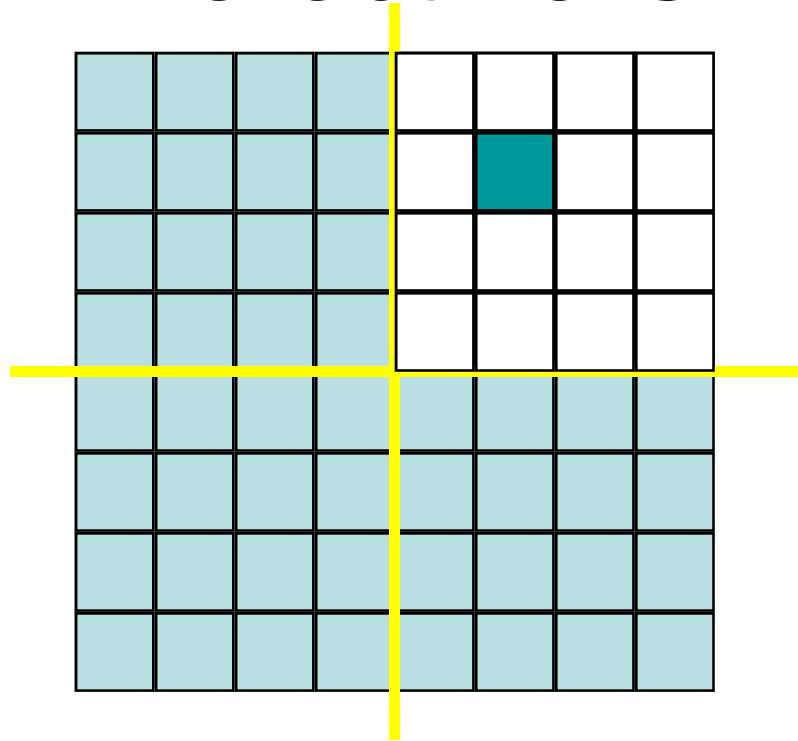
4x4

TX00CO27/JV



8x8

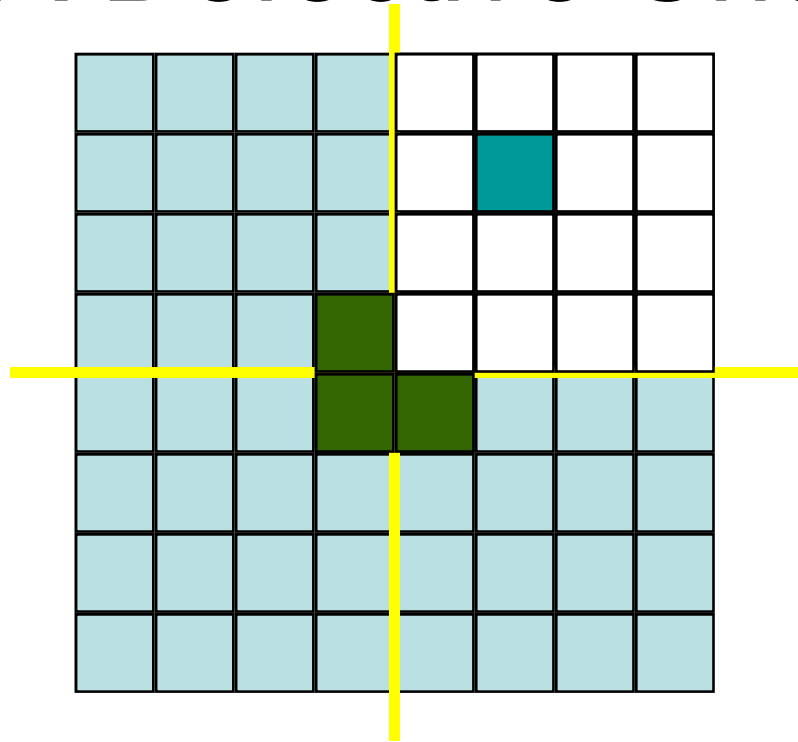
# Tiling A Defective Chessboard



Divide into four smaller chessboards.  $4 \times 4$

One of these is a defective  $4 \times 4$  chessboard.

# Tiling A Defective Chessboard

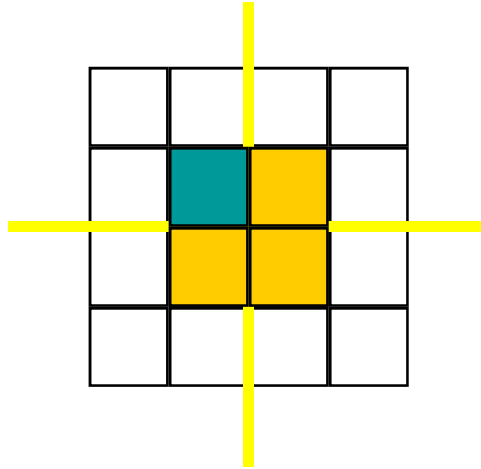


Make the other three  $4 \times 4$  chessboards defective by placing a triomino at their common corner

Recursively tile the four defective  $4 \times 4$  chessboards



# Tiling A Defective Chessboard



# Complexity



- Let  $n = 2^k$
- Let  $t(k)$  be the time taken to tile a  $2^k \times 2^k$  defective chessboard
- $t(0) = d$ , where  $d$  is a constant
- $t(k) = 4t(k-1) + c$ , when  $k > 0$ . Here  $c$  is a constant
- Recurrence equation for  $t()$

# Substitution Method

$$\begin{aligned}t(k) &= 4t(k-1) + c \\&= 4[4t(k-2) + c] + c \\&= 4^2 t(k-2) + 4c + c \\&= 4^2[4t(k-3) + c] + 4c + c \\&= 4^3 t(k-3) + 4^2c + 4c + c \\&= \dots \\&= 4^k t(0) + 4^{k-1}c + 4^{k-2}c + \dots + 4^2c + 4c + c \\&= 4^k d + 4^{k-1}c + 4^{k-2}c + \dots + 4^2c + 4c + c \\&= \Theta(4^k) \\&= \Theta(\text{number of triominoes placed})\end{aligned}$$

# Min And Max

Find the lightest and heaviest of  $n$  elements using a balance that allows you to compare the weight of 2 elements



Minimize the number of comparisons

# Max Element

- Find element with max weight from  $w[0:n-1]$

```
maxElement = 0;
for (int i = 1; i < n; i++)
    if (w[maxElement] < w[i]) maxElement = i;
```

- Number of comparisons of  $w$  values is  $n-1$

# Min And Max

- Find the max of  $n$  elements making  $n-1$  comparisons
- Find the min of the remaining  $n-1$  elements making  $n-2$  comparisons
- Total number of comparisons is  $2n-3$

# Divide And Conquer

- Small instance
  - $n \leq 2$
  - Find the min and max element making at most one comparison

# Large Instance Min And Max

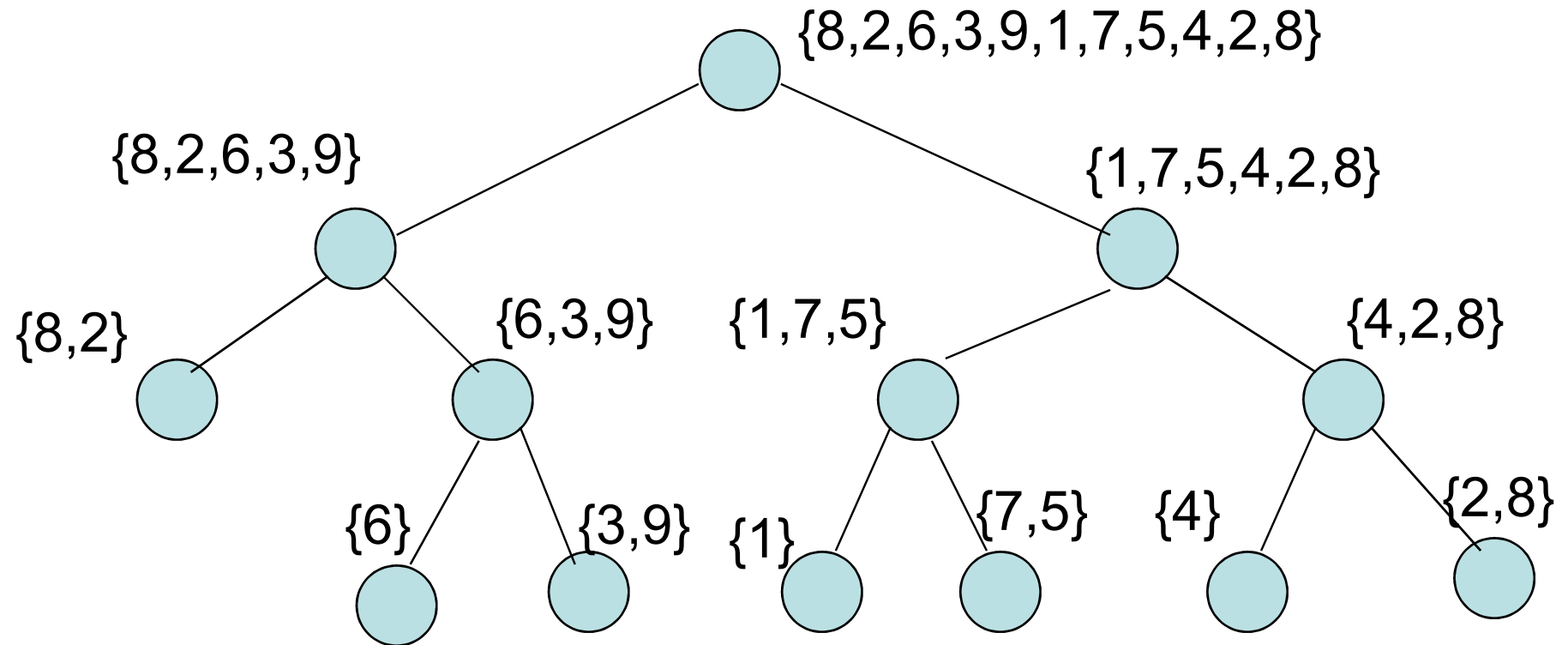
- $n > 2$
- Divide the  $n$  elements into 2 groups  $A$  and  $B$  with  $\lfloor n/2 \rfloor$  and  $\lceil n/2 \rceil$  elements, respectively
- Find the min and max of each group recursively
- Overall min is  $\min\{\min(A), \min(B)\}$
- Overall max is  $\max\{\max(A), \max(B)\}$



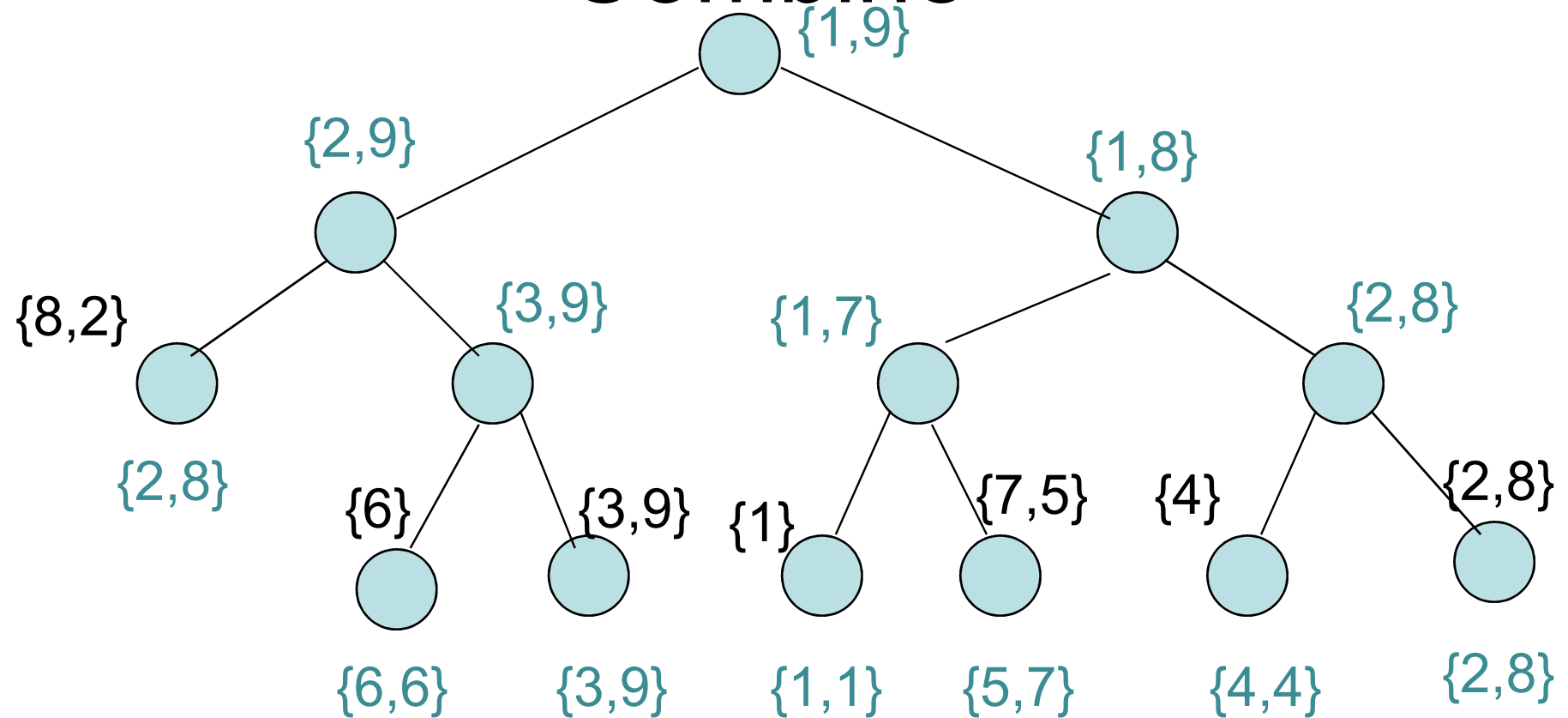
# Min And Max Example

- Find the min and max of  $\{3,5,6,2,4,9,3,1\}$
- Large instance
- $A = \{3,5,6,2\}$  and  $B = \{4,9,3,1\}$
- $\min(A) = 2, \min(B) = 1$
- $\max(A) = 6, \max(B) = 9$
- $\min\{\min(A), \min(B)\} = 1$
- $\max\{\max(A), \max(B)\} = 9$

# Dividing Into Smaller Instances



# Solve Small Instances And Combine



# Time Complexity

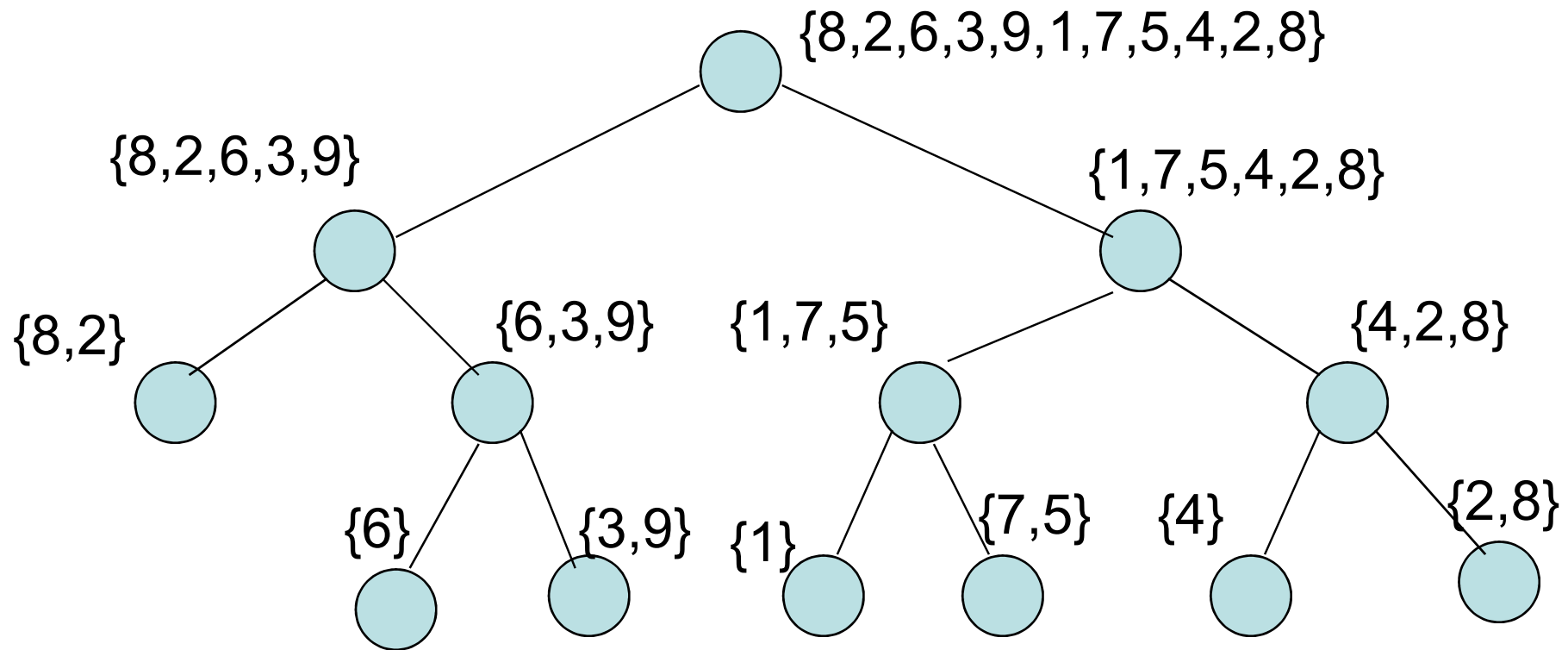


- Let  $c(n)$  be the number of comparisons made when finding the min and max of  $n$  elements
- $c(0) = c(1) = 0$
- $c(2) = 1$
- When  $n > 2$ ,  
$$c(n) = c(\lfloor n/2 \rfloor) + c(\lceil n/2 \rceil) + 2$$
- To solve the recurrence, assume  $n$  is a power of 2 and use repeated substitution
- $c(n) = \lceil 3n/2 \rceil - 2$  (compare this to  $2n-3$  without divide and conquer method)

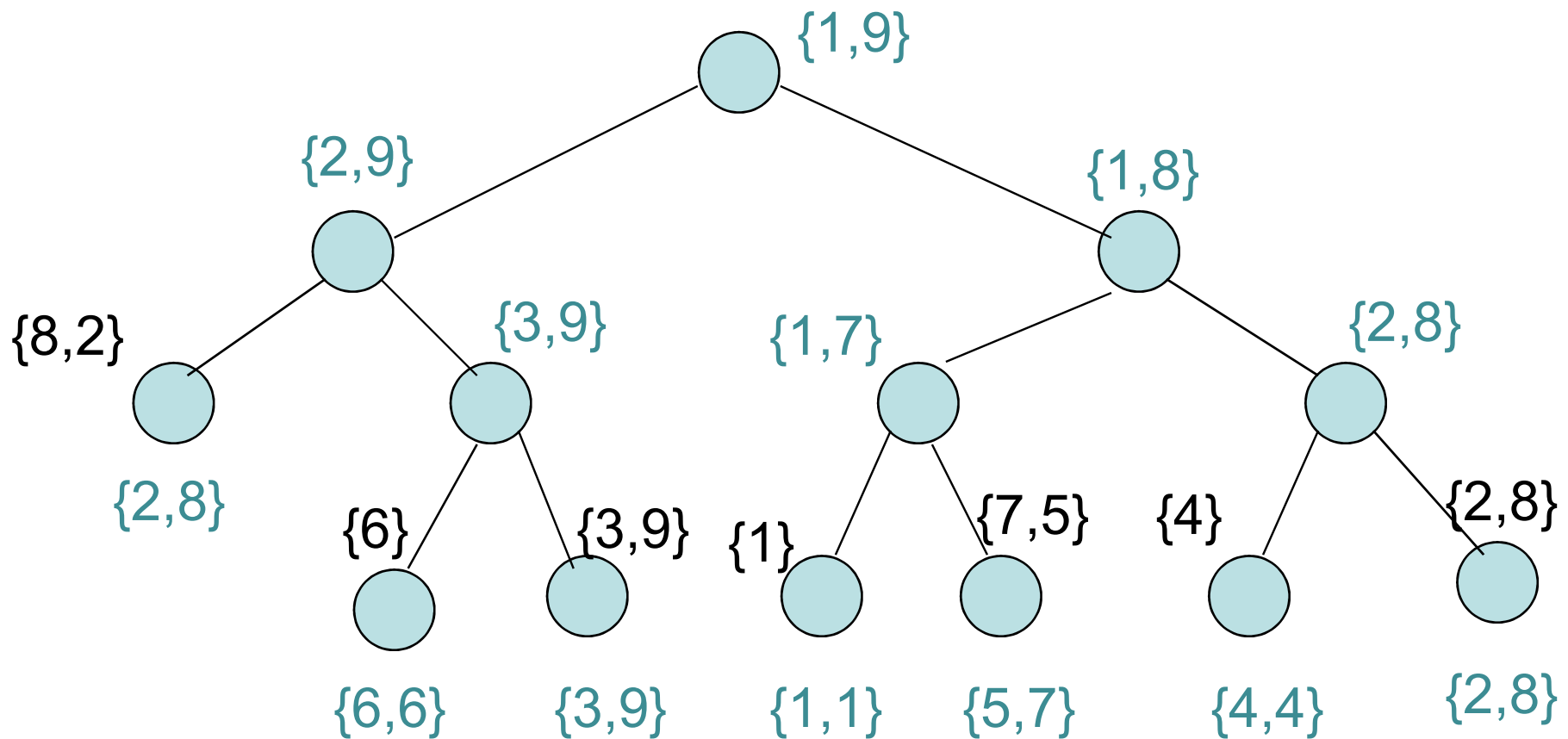
# Interpretation Of Recursive Version

- The working of a recursive divide-and-conquer algorithm can be described by a tree—**recursion tree**
- The algorithm moves down the recursion tree dividing large instances into smaller ones
- Leaves represent **small** instances
- The recursive algorithm moves back up the tree combining the results from the subtrees
- The combining finds the min of the mins computed at leaves and the max of the leaf maxs

# Downward Pass Divides Into Smaller Instances



# Upward Pass Combines Results From Subtrees



# Iterative Version

- Start with  $n/2$  groups with 2 elements each and possibly 1 group that has just 1 element
- Find the min and max in each group
- Find the min of the mins
- Find the max of the maxs



# Iterative Version Example

- {2,8,3,6,9,1,7,5,4,2,8}
- {2,8}, {3,6}, {9,1}, {7,5}, {4,2}, {8}
- mins = {2,3,1,5,2,8}
- maxs = {8,6,9,7,4,8}
- minOfMins = 1
- maxOfMaxs = 9

# Comparison Count

- Start with  $n/2$  groups with 2 elements each and possibly 1 group that has just 1 element
  - No compares
- Find the min and max in each group
  - $\lfloor n/2 \rfloor$  compares
- Find the min of the mins
  - $\lceil n/2 \rceil - 1$  compares
- Find the max of the maxs
  - $\lceil n/2 \rceil - 1$  compares
- Total is  $\lceil 3n/2 \rceil - 2$  compares

# Time Complexity

```

/* find min and max at the same time */
#define VAL(n) ((Titem *))((char *)base+(n)*s)
void minmax(void *base, int s, int n, int (*cmp)(const void *, const void *), int *min, int
*max) {
    int i, start;

    // check simple cases first
    if (n < 1) return;
    else if (n == 1) {
        *min = 0; *max = 0;
        return;
    }

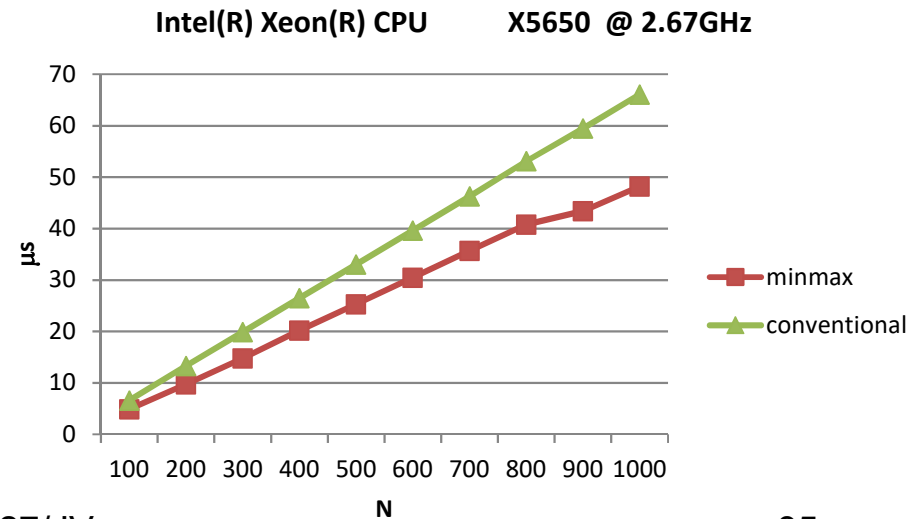
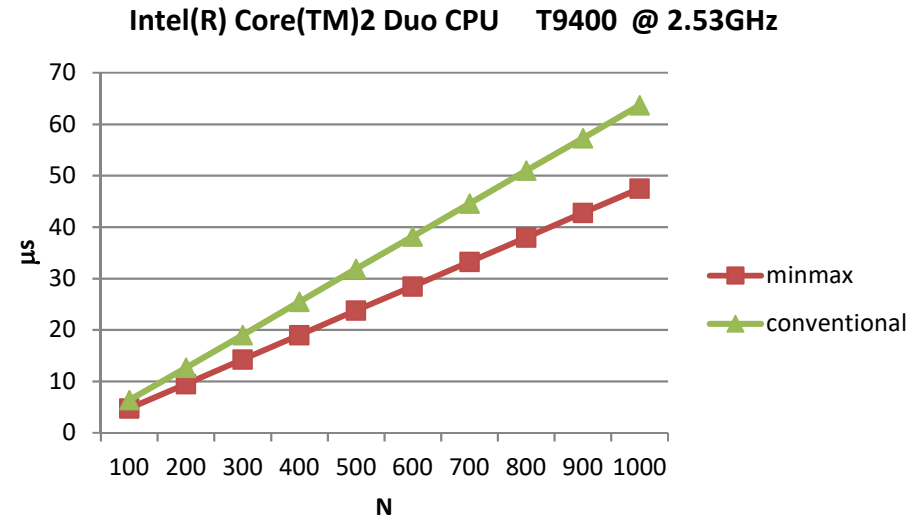
    start = 1;
    if (n % 2 == 1) { // odd lenght
        *min = 0; *max = 0;
    } else { // even lenght
        if (cmp(VAL(0), VAL(1)) > 0) {
            *min = 1; *max = 0;
        } else {
            *min = 0; *max = 1;
        }
        start = 2;
    }

    // compare remaining pairs
    for (i = start; i < n; i += 2) {
        // find larger of base[i] and base[i+1], then compare larger one
        // with base[max] and smaller one with base[min]
        if (cmp(VAL(i), VAL(i+1)) > 0) {
            if (cmp(VAL(i), VAL(*max)) > 0) *max = i;
            if (cmp(VAL(i+1), VAL(*min)) < 0) *min = i+1;
        } else {
            if (cmp(VAL(i+1), VAL(*max)) > 0) *max = i+1;
            if (cmp(VAL(i), VAL(*min)) < 0) *min = i;
        }
    }
}

/* conventional implementation for the minmax */
void minmax2(void *base, int s, int n,
    int (*cmp)(const void *, const void *), int *min, int *max) {
    int i;

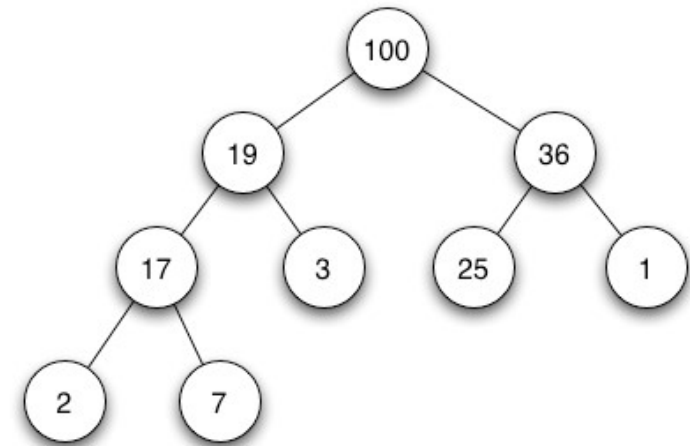
    *min = 0; *max = 0;
    for (i = 0; i < n; i++) {
        if (cmp(VAL(i), VAL(*min)) < 0) *min = i;
        else if (cmp(VAL(i), VAL(*max)) > 0) *max = i;
    }
}

```



# Initialize A Heap

- A max heap (min heap) is a binary max tree (min tree) in which the value in each node is greater (less) than or equal to those in its children (if any)
- $n > 1$ :
  - Initialize left subtree and right subtree recursively
  - Then do a trickle down operation at the root
- $t(n) = c, n \leq 1$
- $t(n) = 2t(n/2) + d * \text{height}, n > 1$
- $c$  and  $d$  are constants
- Solve to get  $t(n) = O(n)$



# Running time of Divide and Conquer Algorithms

- At the lecture 1 we found the running time equation  $T(N)=2T(N/2)+O(N)$  has solution  $O(N\log N)$
- The general solution to the equation  $T(N)=aT(N/b)+\Theta(N^k)$ , where  $a \geq 1$  and  $b \geq 1$ , is

$$T(N) = \begin{cases} O(N^{\log_b a}) & \text{if } a > b^k \\ O(N^k \log N) & \text{if } a = b^k \\ O(N^k) & \text{if } a < b^k \end{cases}$$

# Multiplying integers

- We want to multiply two  $N$ -digit numbers  $X$  and  $Y$ 
  - We assume that the sign is handled separately and therefore  $X, Y \geq 0$
- The algorithm we usually use (when calculating the multiplication by hand) requires  $\Theta(N^2)$  operations (each digit in  $X$  is multiplied by each digit in  $Y$ )
- If  $X = 61\,438\,521$  and  $Y = 94\,736\,407$  then  $XY = 5\,820\,464\,730\,934\,047$
- If we break  $X$  and  $Y$  into two halves, consisting most significant and least significant digits, respectively
  - Then  $X_L = 6\,143$ ,  $X_R = 8\,521$ ,  $Y_L = 9\,473$ , and  $Y_R = 6\,407$
  - We also have  $X = X_L 10^4 + X_R$  and  $Y = Y_L 10^4 + Y_R$ . It follows that  $XY = X_L Y_L 10^8 + (X_L Y_R + X_R Y_L) 10^4 + X_R Y_R$
  - This equation contains four multiplications which are half the size of the original problem ( $N/2$  digits), multiplication by  $10^4$  and  $10^8$  amount to the placing of zeros. This and the subsequent additions add only  $O(N)$  additional work
  - If these four multiplications are performed recursively, stopping at the appropriate base case, we obtain the recurrence  $T(N) = 4T(N/2) + O(N)$  which can be seen  $T(N) = O(N^2)$ 
    - So, unfortunately, we have not improved the algorithm
    - To achieve subquadratic algorithm, we must use less than four recursive calls

# Multiplying integers

- The mathematician Gauss once noticed that although the product of two complex numbers  $(a+bi)(c+di)=ac-bd+(bc+ad)i$  seems to involve four real-number multiplications, it can in fact be done with just three, since  $bc+ad=(a+b)(c+d)-ac-bd$
- This is the key observation in reducing the number of multiplications that  $X_L Y_R + X_R Y_L = (X_L - X_R)(Y_R - Y_L) + X_L Y_L + X_R Y_R$ 
  - Thus, instead of using two multiplications to compute the coefficient of  $10^4$ , we can use one multiplication, plus the result of two multiplications that have already been performed
  - Now we need only three multiplications (= recursive subproblems) to be solved
  - The recurrence equation is now  $T(N)=3T(N/2) + O(N)$  and so we obtain  $T(N) = O(N^{\log_2 3}) = O(N^{1.59})$ 
    - To complete the algorithm, we must have a base case, which can be solved without recursion
      - When both numbers are one-digit, we can do the multiplication by table lookup
      - If one number has zero digits, then we return zero

# Multiplying integers

- When both numbers are one digit, we can do multiplication by table lookup
- If one number has zero digits, then we return zero
- In practice, the base case should be set to that which is most convenient for the machine
- If numbers are not equal in size, a smaller one must be zero padded, e.g.  $3 \times 15$  must be adjusted to  $03 \times 15$

```
function multiply(x,y)
```

Input: two  $n$ -digit numbers  $x$  and  $y$

Output: their product

```
if  $n=1$ : return  $xy$ 
```

```
 $x_l, x_r$  = leftmost, rightmost  $\lceil n/2 \rceil$  digits of  $x$ 
```

```
 $y_l, y_r$  = leftmost, rightmost  $\lceil n/2 \rceil$  digits of  $y$ 
```

```
 $p_1$  = multiply( $x_l, y_l$ )
```

```
 $p_2$  = multiply( $x_r, y_r$ )
```

```
 $p_3$  = multiply( $x_l+x_r, y_l+y_r$ )
```

```
return  $P_1 \times 10^n + (P_3 - P_1 - P_2) \times 10^{n/2} + P_2$ 
```