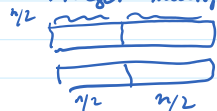


- Brute force (exhaustive search)
- Transform: (simplification, representation, reduction)
- Decrease: (recursion)
- DIVIDE: solve (multiple) smaller instances of size  $n/b$  and recombine the solutions

Ex: Fast integer multiplication.



input: 2  $n$ -bit integers  $A, B$

output:  $AB$



$$M(1) = 0$$

$$M(n) = 3M\left(\frac{n}{2}\right) + \Theta(n), \quad n = 2^m$$

$$M(n) = \Theta(n^{\log_2 3} = 1.58 \dots)$$

$$\begin{aligned} & (A_1 + B_1) \times 10^n \\ & \begin{bmatrix} (A_1 + B_1) + (B_1 B_2) \\ - A_1 B_1 \\ - A_2 B_2 \end{bmatrix} \times 10^{n/2} \end{aligned}$$

Ex: Binary Search

INPUT: sorted array,  $x$

OUTPUT: true if  $x$  is in array



$$B(1) = 1$$

$$B(n) = 1 + B\left(\frac{n}{2}\right), \quad n = 2^m$$

$$B(n) = \Theta(n^0 \lg n) = \lg n$$

Ex: Merge Sort



$$M(1) = 0$$

$$M(n) = 2M\left(\frac{n}{2}\right) + \Theta(n), \quad M(n) = \Theta(n^1 \lg n)$$

DIVIDE - CONQUER TEMPLATE

- divide
- recurse (conquer)
- combine

POWER MOD (recursive)

INPUT: nonnegative integer  $b, e, m$ ; input size

OUTPUT:  $(b^e) \% m$

ans = 1

naive: for ( $i = 1; i \leq e; i++$ )  
{  
    ans = (ans \* b) % m;  
}  
return ans;

$$\Theta(e) = \Theta(10^{\lg e})$$

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divide conquer:  $b^e \% m = (b^{e/2})^2 \% m$

pm( $b, e, m$ )  
{

if ( $e == 0$ )

return 1;

if ( $e \% 2 == 0$ )

$$e = 4, \quad b^4 = (b^2)^2$$

$$b^5 = b \cdot b^4$$

```

return 1;
if (e % 2 == 0)
{
    temp = pm(b, e/2, m);
    return (temp * temp) % m;
}
else
{
    temp = pm(b, e/2, m);
    return (((temp * temp) % m) * b) % m;
}
}

```

$$b^5 = b \cdot b^4 = b \cdot (b^2)^2$$

$$b^{14} = (b^7)^2$$

$$\downarrow$$

$$b \cdot b^6 = b(b^3)^2$$

$$b^3 = b \cdot b^2$$

$$b = b(b^1)^2$$

$$M(0) = -$$

$$M(1) = -$$

$$M(e) = 2 + 1M(\frac{e}{2}), \quad e = 2^m$$

$$a = 1$$

$$b = 2$$

$$d = 6$$

$$l = 2^0$$

$$M(e) = \Theta(e \lg e) = \Theta(\lg e)$$

input size

Ex: QUICK SORT (ONLY HOME)

Divide-conquer: divide / conquer / combine

MERGE

$\Theta(1)$   $2M(\frac{n}{2})$

$\Theta(n)$

QUICK

$\Theta(n)$   $2M(\frac{n}{2})$

0

3 1 4 8 7 6 2 5 pivot

< pivot pivot > pivot

4 2 5 7 8

1 3 6

1 2 3 4 5 6 7 8

qs(A[lo..hi]) n = hi - lo + 1

{ if (lo < hi)

{ k = partition(A[lo..hi]); // k = final position of pivot

Q(l) { qs(A[lo..k-1]);

Q(n-1-l) { qs(A[k+1..hi]);

}

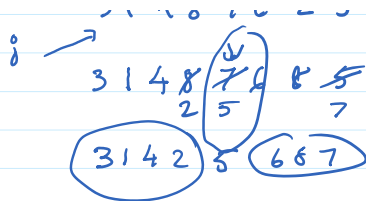
How partition works.

i → 3 1 4 8 7 6 2 5

j → 3 1 4 8 7 6 2 5

3 1 4 8 7 6 2 5

3 1 4 2 5 6 7 8

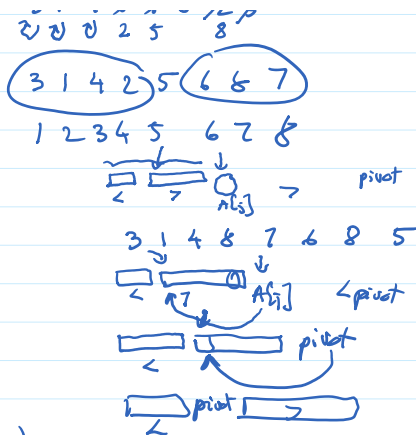


partition (A[lo...hi])

```

{
    i = lo;
    for (j = lo; j < hi; j++)
    {
        if (A[j] < A[hi])
            swap(A[j], A[i++]);
    }
    swap(A[hi], A[i]);
    return i;
}

```



#### ANALYSIS OF PARTITION

$P(n)$ : Count # of comparisons of array elements

$$P(n) = \sum_{j=lo}^{hi-1} (1) = hi-1-lo+1 = hi-lo = n-1, \quad n = hi-lo+1$$

#### ANALYSIS OF QUICKSORT

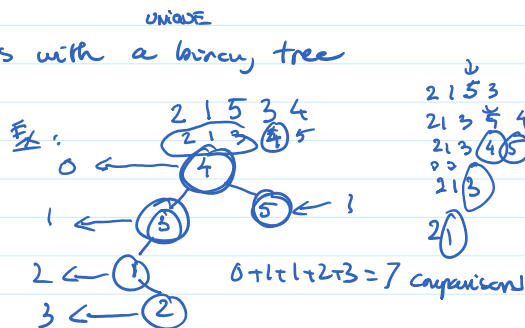
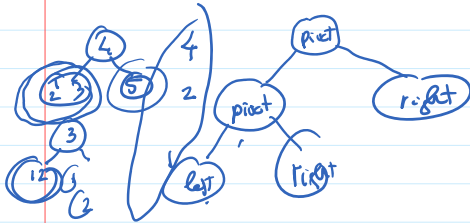
$Q(n)$  = <sup>WORST-CASE</sup> # of comparisons of array elements

$$Q(1) = 0$$

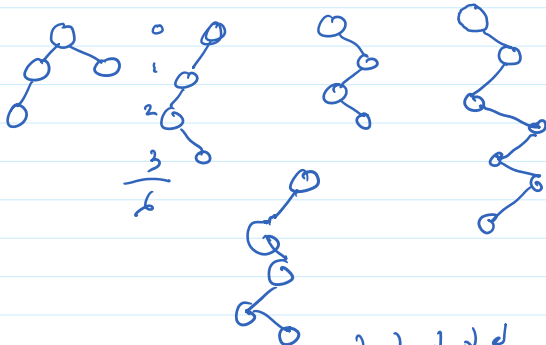
$$Q(n) = \max_{0 \leq l \leq n-1} \{Q(l) + Q(n-l-1) + (n-1)\}, \quad n > 1.$$

How to solve this recurrence ??

- Use calculus (messy)
- Associate each run of QS with a binary tree



KEY IDEA: # of comparisons made by a run of QS = total sum of depths of the corresponding binary tree

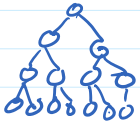


$$0 + 1 + 2 + \dots + (n-1) = \frac{(n-1)n}{2}$$

$$Q(n) = \frac{n(n-1)}{2}$$

$$1 \cdot 2 \cdot 3 \cdot 4 = \underline{5(4)}.$$

Best Case  $\Theta(n \lg n)$

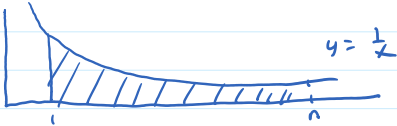


Average Case : (assuming each permutation is equally likely)  $\Theta(n \lg n)$

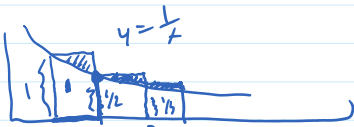
$$Ave(n) = 2(n+1) H(n) - 4n$$

$H(n)$   $\leftarrow$   $n^{\text{th}}$  harmonic number  $= 1 + \frac{1}{2} + \frac{1}{3} + \frac{1}{4} + \dots + \frac{1}{n}$

$$\ln(n) =$$

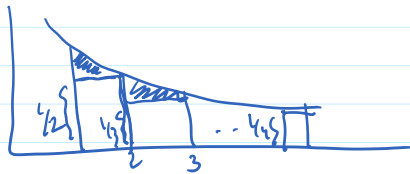


$$\ln(n) = \int_1^n \frac{1}{x} dx$$



$$\frac{1}{1} + \frac{1}{2} + \dots + \frac{1}{n-1} = H(n-1)$$

$$\ln(x) \leq H(n-1)$$



$$H(n) - 1 \leq \ln n \leq H(n-1)$$

$$H(n) \leq 1 + \ln n$$

$$H(n) \geq \ln(n+1)$$

$$H(n) - 1 = \frac{1}{2} + \frac{1}{3} + \dots + \frac{1}{n} \leq \ln(n)$$

$$\ln(n+1) \leq H(n) \leq 1 + \ln n$$

RECURSIVE IDEA: use median as pivot

this will lead to

$$Q(n) = 2Q\left(\frac{n}{2}\right) + \Theta(n)$$

$\leftarrow$  if we can find median in linear time

$$= \Theta(n \lg n) !!!$$

WORST-CASE

smallest

$$n-1$$

2<sup>nd</sup> smallest

$$n-1 + n-2 = 2n-3$$

3<sup>rd</sup> smallest

$$n-1 + n-2 + n-3 = 3n-6$$

$k^{\text{th}}$  smallest ( $k$  is an input):  $k(n) = \dots$

$$k = \frac{n}{2}$$

$$\frac{n}{2} + n = \frac{n^2}{2}$$