



**IIT Madras**  
BSc Degree

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## PDSA - Week 8

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### PDSA - Week 8

- Divide and conquer
- Divide and conquer example
  - Counting inversions
  - Closest pair of points
  - Integer multiplication
  - Quick select and Fast select
  - Median of Medians(MoM)
  - Fast select using MOM
- Recursion trees

## Divide and conquer

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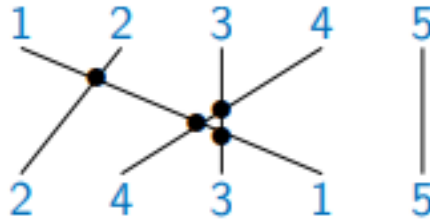
- Break up a problem into disjoint subproblems
- Combine these subproblem solutions efficiently
- **Examples**
  - **Merge sort**
    - Split into left and right half and sort each half separately
    - Merge the sorted halves
  - **Quicksort**
    - Rearrange into lower and upper partitions, sort each partition separately
    - Place pivot between sorted lower and upper partitions

## Divide and conquer example

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### Counting inversions

- Compare your profile with other customers
- Identify people who share your likes and dislikes
- No inversions – rankings identical
- Every pair inverted – maximally dissimilar
- Number of inversions ranges from 0 to  $n(n - 1) / 2$



- An inversion is a pair  $(i, j)$ ,  $i < j$ , where  $j$  appears before  $i$
- Recurrence:  $T(n) = 2T(n/2) + n = O(n \log n)$

## Implementation

```

1  def mergeAndCount(A,B):
2      (m,n) = (len(A),len(B))
3      (C,i,j,k,count) = ([],0,0,0,0)
4      while k < m+n:
5          if i == m:
6              C.append(B[j])
7              j += 1
8              k += 1
9          elif j == n:
10             C.append(A[i])
11             i += 1
12             k += 1
13          elif A[i] < B[j]:
14              C.append(A[i])
15              i += 1
16              k += 1
17          else:
18              C.append(B[j])
19              j += 1
20              k += 1
21              count += m-i
22      return(C,count)
23
24  def inversionCount(A):
25      n = len(A)
26      if n <= 1:
27          return(A,0)
28      (L,countL) = inversionCount(A[:n//2])
29      (R,countR) = inversionCount(A[n//2:])
30      (B,countB) = mergeAndCount(L,R)
31      return(B,countL + countR + countB)
32  L = [2,4,3,1,5]
33  print(inversionCount(L)[1])

```

## Output

```

1  4 # 4 is the number of inversions

```

## Closest pair of points

- Several objects on screen
- Basic step: find closest pair of objects
- $n$  objects — naive algorithm is  $n^2$ 
  - For each pair of objects, compute their distance
  - Report minimum distance across all pairs
- There is a clever algorithm that takes time  $O(n \log n)$  using divide and conquer
- Given  $n$  points  $p_1, p_2, \dots, p_n$  find the closest pair
  - Assume no two points have same  $x$  or  $y$  coordinate
  - Split the points into two halves by vertical line
  - Recursively compute closest pair in each half
  - Compare shortest distance in each half to shortest distance across the dividing line
- Recurrence:  $Tn = 2Tn/2 + O(n)$
- Overall:  $O(n \log n)$

### Pseudocode

```

1  def ClosestPair(Px,Py):
2      if len(Px) <= 3:
3          compute pairwise distances
4          return closest pair and distance
5      Construct (Qx,Qy), (Rx,Ry)
6      (q1,q2,dQ) = ClosestPair(Qx,Qy)
7      (r1,r2,dR) = ClosestPair(Rx,Ry)
8      Construct Sy from Qy,Ry
9      Scan Sy, find (s1,s2,dS)
10     return (q1,q2,dQ), (r1,r2,dR), (s1,s2,dS)
11     #depending on which of dQ, dR, dS is minimum

```

### Implementation

```

1  import math
2
3  # Returns euclidean distance between points p and q
4  def distance(p, q):
5      return math.sqrt(math.pow(p[0] - q[0],2) + math.pow(p[1] - q[1],2))
6
7  def minDistanceRec(Px, Py):
8      s = len(Px)
9      # Given number of points cannot be less than 2.
10     # If only 2 or 3 points are left return the minimum distance accordingly.
11     if (s == 2):
12         return distance(Px[0],Px[1])
13     elif (s == 3):
14         return min(distance(Px[0],Px[1]), distance(Px[1],Px[2]),
15                     distance(Px[2],Px[0]))
16
17     # For more than 3 points divide the points by point around median of x
18     # coordinates
19     m = s//2

```

```

18 Qx = Px[:m]
19 Rx = Px[m:]
20 xR = Rx[0][0]    # minimum x value in Rx
21
22 # Construct Qy and Ry in O(n) rather from Py
23 Qy=[]
24 Ry=[]
25 for p in Py:
26     if(p[0] < xR):
27         Qy.append(p)
28     else:
29         Ry.append(p)
30
31 # Extract Sy using delta
32 delta = min(minDistanceRec(Qx, Qy), minDistanceRec(Rx, Ry))
33 Sy = []
34 for p in Py:
35     if abs(p[0]-xR) <= delta:
36         Sy.append(p)
37
38 #print(xR,delta,Sy)
39 sizes = len(Sy)
40 if sizes > 1:
41     mins = distance(Sy[0], Sy[1])
42     for i in range(1, sizes-1):
43         for j in range(i, min(i+15, sizes)-1):
44             mins = min(mins, distance(Sy[i], Sy[j+1]))
45     return min(delta, mins)
46 else:
47     return delta
48
49 def minDistance(Points):
50     Px = sorted(Points)
51     Py = Points
52     Py.sort(key=lambda x: x[-1])
53     #print(Px,Py)
54     return round(minDistanceRec(Px, Py), 2)
55
56
57
58 pts = [(2, 15), (40, 5), (20, 1), (21, 14), (1,4), (3, 11)]
59 mul = 0
60 if (len(pts) > 100): mul = 0
61 result = minDistance(pts)
62 for i in range(mul):
63     minDistance(pts)
64 print(result)

```

## Output

1 | 4.12

## Integer multiplication

- Traditional method:  $O(n^2)$
- Naïve divide and conquer strategy:  $T(n) = 4T(n/2) + n = O(n^2)$
- Karatsuba's algorithm:  $T(n) = 3T(n/2) + n \approx O(n \log 3)$

### Implementation

```

1  # here 10 represent base of input numbers x and y
2  def Fast_Multiply(x,y,n):
3      if n == 1:
4          return x * y
5      else:
6          m = n/2
7          xh = x//10**m
8          xl = x % (10**m)
9          yh = y//10**m
10         yl = y % (10**m)
11         a = xh + xl
12         b = yh + yl
13         p = Fast_Multiply(xh, yh, m)
14         q = Fast_Multiply(xl, yl, m)
15         r = Fast_Multiply(a, b, m)
16         return p*(10**n) + (r - q - p) * (10**(n/2)) + q
17 print(Fast_Multiply(3456,8902,4))

```

### Output

```

1  30765312.0

```

## Quick select and Fast select

- Find the  $k_{th}$  smallest value in a sequence of length  $k$
- Sort in descending order and look at position  $k - O(n \log n)$
- For any fixed  $k$ , find maximum for  $k$  times -  $O(kn)$
- $k = n/2$  (median) -  $O(n^2)$
- Median of medians -  $O(n)$
- Selection becomes  $O(n)$  in Fast select algorithm
- Quicksort becomes  $O(n \log n)$  using MoM

### Implementation

```

1  def quickselect(L,l,r,k): # k-th smallest in L[l:r]
2      if (k < 1) or (k > r-1):
3          return(None)
4
5      (pivot,lower,upper) = (L[l],l+1,l+1)
6      for i in range(l+1,r):
7          if L[i] > pivot: # Extend upper segment
8              upper = upper + 1
9          else: # Exchange L[i] with start of upper segment
10             (L[i], L[lower]) = (L[lower], L[i])

```

```

11     (lower,upper) = (lower+1,upper+1)
12     (L[l],L[lower-1]) = (L[lower-1],L[l]) # Move pivot
13     lower = lower - 1
14
15     # Recursive calls
16     lowerlen = lower - 1
17     if k <= lowerlen:
18         return(quickselect(L,l,lower,k))
19     elif k == (lowerlen + 1):
20         return(L[lower])
21     else:
22         return(quickselect(L,lower+1,r,k-(lowerlen+1)))
23 print(quickselect([5,3,7,2,1],0,5,2))

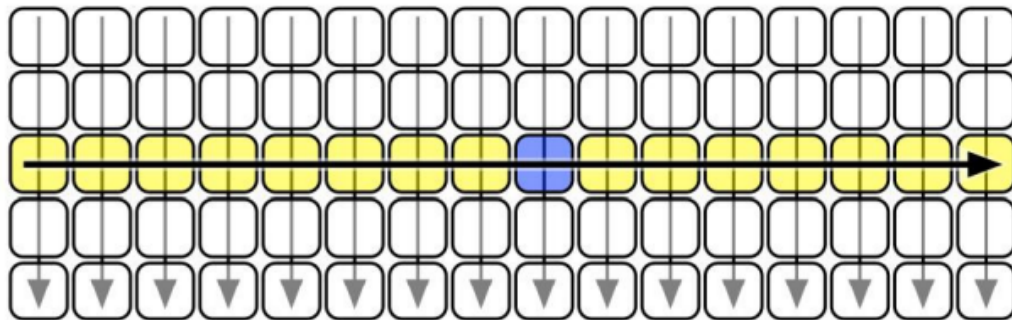
```

## Output

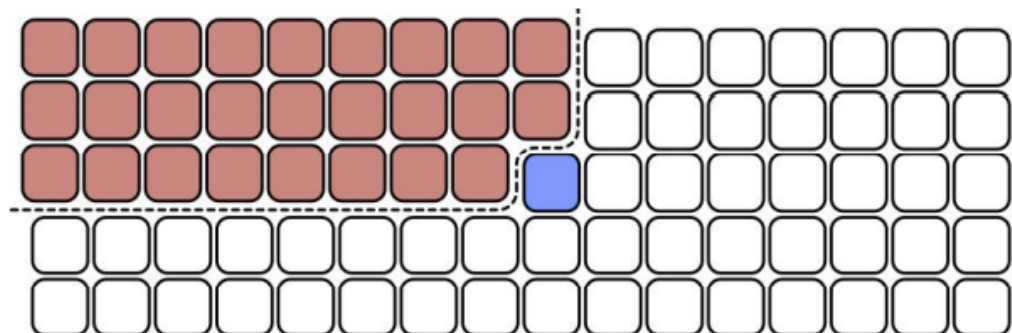
1 | 2

## Median of Medians(MoM)

- Divide L into blocks of 5
- Find the median of each block (brute force)
- Let M be the list of block medians
- Recursively apply the process to M
- We can visualize the blocks as follows



- Each block of 5 is arranged in ascending order, top to bottom
- Block medians are the middle row
- The median of block medians lies between  $3\text{len}(L)/10$  and  $7\text{len}(L)/10$



## Implementation

```

1 def MoM(L): # Median of medians
2     if len(L) <= 5:
3         L.sort()
4         return(L[len(L)//2])
5     # Construct list of block medians
6     M = []
7     for i in range(0,len(L),5):
8         X = L[i:i+5]
9         X.sort()
10        M.append(X[len(X)//2])
11    return(MoM(M))
12 print(MoM([4,3,5,6,2,1,8,9,7,10,13,15,18,17,11]))

```

## Output

```
1 | 8
```

## Fast select using MOM

### Implementation

```

1 def MoM(L): # Median of medians
2     if len(L) <= 5:
3         L.sort()
4         return(L[len(L)//2])
5     # Construct list of block medians
6     M = []
7     for i in range(0,len(L),5):
8         X = L[i:i+5]
9         X.sort()
10        M.append(X[len(X)//2])
11    return(MoM(M))
12
13
14
15 def fastselect(L,l,r,k): # k-th smallest in L[l:r]
16     if (k < l) or (k > r-1):
17         return(None)
18
19     # Find MoM pivot and move to L[l]
20     pivot = MoM(L[l:r])
21     pivotpos = min([i for i in range(l,r) if L[i] == pivot])
22     (L[l],L[pivotpos]) = (L[pivotpos],L[l])
23
24     (pivot,lower,upper) = (L[l],l+1,l+1)
25     for i in range(l+1,r):
26         if L[i] > pivot: # Extend upper segment
27             upper = upper + 1
28         else: # Exchange L[i] with start of upper segment
29             (L[i], L[lower]) = (L[lower], L[i])

```

```

30     (lower, upper) = (lower+1, upper+1)
31     (L[l], L[lower-1]) = (L[lower-1], L[l]) # Move pivot
32     lower = lower - 1
33
34     # Recursive calls
35     lowerlen = lower - 1
36     if k <= lowerlen:
37         return(fastselect(L, l, lower, k))
38     elif k == (lowerlen + 1):
39         return(L[lower])
40     else:
41         return(fastselect(L, lower+1, r, k-(lowerlen+1)))
42 print(fastselect([4,3,5,6,2,1,8,9,7,10,13,15,18,17,11], 0, 15, 4))

```

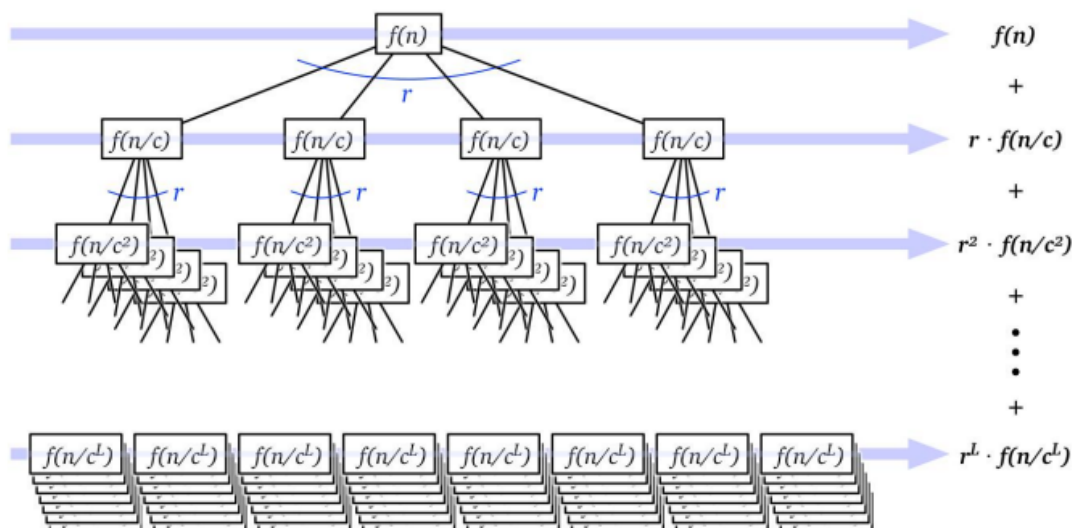
## Output

1 | 4

## Recursion trees

- **Recursion tree**-Rooted tree with one node for each recursive subproblem
- **Value** of each node is time spent on that subproblem excluding recursive calls
- Concretely, on an input of size  $n$ 
  - $f(n)$  is the time spent on non-recursive work
  - $r$  is the number of recursive calls
  - Each recursive call works on a subproblem of size  $n/c$
- Resulting recurrence:  $T(n) = rT(n/c) + f(n)$
- Root of recursion tree for  $T(n)$  has value  $f(n)$
- Root has  $r$  children, each (recursively) the root of a tree for  $T(n/c)$
- Each node at level  $d$  has value  $f(n/c^d)$ 
  - Assume, for simplicity, that  $n$  was a power of  $c$

### Recursion tree for $T(n) = rT(n/c) + f(n)$





- Leaves correspond to the base case  $T(1)$ 
  - Safe to assume  $T(1) = 1$ , asymptotic complexity ignores constants
- Level  $i$  has  $r^i$  nodes, each with value  $f(n/c^i)$
- Tree has  $L$  levels,  $L = \log_c n$
- Total cost is  $T(n) = \sum_{i=0}^L r^i \cdot f(n/c^i)$
- Number of leaves is  $r^L$ 
  - Last term in the level by level sum is  $r^L \cdot f(1) = r^{\log_c n} \cdot 1 = n^{\log_c r}$
  - Recall that  $a^{\log_b c} = c^{\log_b a}$
- Tree has  $\log_c n$  levels, last level has cost is  $n^{\log_c r}$
- Total cost is  $T(n) = \sum_{i=0}^L r^i \cdot f(n/c^i)$
- Think of the total cost as a series. Three common cases
- **Decreasing** Each term is a constant factor smaller than previous term
  - Root dominates the sum,  $T(n) = O(f(n))$
- **Equal** All terms in the series are equal
  - $T(n) = O(f(n) \cdot L) = O(f(n) \log n)$  —  $\log_c n$  is asymptotically same as  $\log n$
- **Increasing** Series grows exponentially, each term a constant factor larger than previous term
  - Leaves dominate the sum,  $T(n) = O(n^{\log_c r})$