

# 17. Searching and Sorting

## Topics:

Linear Search

Binary Search

Measuring Execution Time

The Divide and Conquer Framework

Merge Sort

# Search

## Examples:

Is this song in that playlist?

Is this number in that phone book?

Is this name in that phone book?

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Is this fingerprint in that archive of fingerprints?

Is this photo in that yearbook?

# More on Using Phone Books

The Manhattan phone book has 1,000,000+ entries.

How is it possible to locate a name by examining just a tiny, tiny fraction of those entries?

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195 Car C

17 566-1282	Cartage New England Inc	24 Hillcock Ros 02131.....	617 327-1105	Carter F	24 Hillcock Ros 02131.....	617 327-1105	Carter Nella E	323 Maschets Av Bos 02115.....	617 267-6483					
81 447-4101	Cartagema Lydia	18 Jewett Ros 02131.....	617 323-7639	Faye & Ricky	357 Columbus Av Bos 02116.....	617 437-7331	Nicholas S F	115 Randolph Av Mil 02186.....	617 698-5307					
00 257-9981	Cartagema Avith	9 Bancroft Ros 02119.....	617 442-9780	Francis S	134 Temple W Ros 02132.....	617 323-6781	Nick & Debbie	21 Fairfield Bos 02115.....	617 267-5222					
17 566-1282	B Hyd 02136.....	617 361-5253	Franklin & Anne	221 Mt Auburn Cam 02138.....	617 354-0798	Fred	42 Haverford Jam 02130.....	617 524-3078	106 Herrick Rd Newton 02459.....	617 527-0480				
17 364-5188	Jessica	40 Decatur Cha 02129.....	617 241-0152	Fred	96 Hinckley Rd Mil 02186.....	617 698-1343	G & R	8 Verdun Dor 02124.....	617 436-8906	Nicole.....	617 698-0713			
361-0380	Melvin	501 Green Cam 02139.....	617 576-1061	G T	27 Franklin Av Som 02145.....	617 623-7121	G T	27 Franklin Av Som 02145.....	617 623-7121	Norman G	38 Chickatawout Dor 02122.....	617 822-1203		
17 566-4548	Carte Nicholas	18 Appleton Boston 02116.....	617 695-6996	Gayle	25 Frontenac Dor 02124.....	617 825-0322	Geo S	115 Moss Hill Rd Jam 02130.....	617 522-3215	P A	44 Crestwood Pk Ros 02121.....	617 427-4754		
17 628-8248	Cartena O	4 Milford Bos 02118.....	617 338-8219	George	125 Nashua Bos 02114.....	617 367-9548	P L	44 Hutchings Ros 02121.....	617 427-9170	P E	501 E Sixth St Bos 02127.....	617 268-4213		
17 445-5116	Carten Thos J Sr & Claire	1 Paradise Rd Mil 02186.....	617 698-6163	Carten Holliday Associate	107 S Street Bos 02111.....	617 456-1689	P R	91 Byrner Jam 02130.....	617 983-8692	Paul & Constance	114 Anawan Av W Ros 02132.....	617 325-2036		
17 822-2982	Thomas & Kathleen	50 Thompson Ln Mil 02186.....	617 696-6919	Carten Harry F	26 Runging Rk Rd W Ros 02132.....	617 325-5465	Paul E	501 E Sixth St Bos 02127.....	617 268-4546	Paul M	27 Union Bri 02135.....	617 787-2115		
17 427-5712	Cartar A	Ros 02131.....	617 327-2257	Cartar Hide Co Inc	146 Summer Bos 02110.....	617 542-7987	Cartar Pile Driving Inc	17 Beaver Ct Framingham 01702.....	Wellesley Tello-781 235-8488	Prudence	46 Franklin Watertown 02172.....	617 393-3782		
17 569-2698	A Rosbury.....	617 442-5230	Cartar Hilary	61 Harvey Cam 02140.....	617 876-2750	Horace	241 Walnut Av Rosbury 02119.....	617 442-5307	Howard Jr	26 Notre Dame Ros 02119.....	617 445-5552	Reginald	106 Brunswick Dorchester 02121.....	617 541-2843
17 667-5190	A 31 Bethune Wy Roxbury 02119.....	617 442-1219	A 260 Pelham Av Cambridge 02139.....	617 492-4174	Howard Jr	26 Notre Dame Ros 02119.....	617 445-5552	J	15 Chatham Bro 02446.....	617 232-7990	Renee & Andrew	10 Walnut Bos 02108.....	617 720-3765	
17 569-1417	A M	255 Maschets Av Bos 02115.....	617 266-7153	Alice	108 Kilmarnock Bos 02215.....	617 425-0193	J	518 Harvard Bro 02446.....	617 730-9483	Cartar Rice Dowd	Bulky Danton Publishing 163 Main Wilmington 01887	800 638-1671		
17 338-9110	Andrew F	62 Vinal Av Som 02143.....	617 625-7623	Cartar Anne MD	1101 Beacon Bro 02446.....	617 739-1022	J	75 Viny Way West Roxbury 02132.....	617 323-5574	Call Free-Dial '1' & Then.....	800 619-7447			
17 825-9195	Cartar Athens	272 Newbury Boston 02116.....	617 536-6329	Cartar J Jacques MD	1 Brookline Pl Bro 02446.....	617 735-8787	Cartar J M	1410 Columbia Rd S Bos 02127.....	617 464-1040	Call Free-Dial '1' & Then.....	800 648-7447			
17 670-2078	B E	68 Gladeside Av Mat 02126.....	617 296-6911	Cartar J M	1573 Cambridge St Cam 02138.....	617 492-1214	Cartar J Veal Co	48 Newmarket Sq Rox 02118.....	617 442-1775	Call Free-Dial '1' & Then.....	978 988-7447			
17 623-9001	Cartar Barbara L MD	Tufts-New England Medical Center Bos 02111	617 636-0051	Cartar James	1573 Cambridge St Cam 02138.....	617 492-1214	James	182 Fisher Av Rosbury 02120.....	617 739-2193	Call Free-Dial '1' & Then.....	800 638-1673			
17 296-4725	Cartar Becky	Bos 02114.....	617 523-4368	James	37 Gold Star Rd Cambridge 02140.....	617 876-8841	Jas L	14 Roseberry Rd Mat 02126.....	617 361-0773	Cartar Richard	1079 Commwth Av Brighton 02215.....	617 987-0836		
17 542-1521	Bernard J	112 Gladstone E Bos 02128.....	617 567-3430	Jane	114 Adams Rd Newton 02465.....	617 964-0435	Jane	114 Adams Rd Newton 02465.....	617 964-0435	Cartar Richard A MD	170 Commwth Av Bos 02116.....	617 267-0710		
17 364-5232	Bithiah	25 Medway Dor 02124.....	617 298-8713	Jeffrey	41 Warren Av Bos 02116.....	617 426-5994	John	11 Mansfield Bri 02134.....	617 987-2163	Cartar Richard K	15 Mercer S Bos 02127.....	617 268-0448		
17 541-5649	Blake	26 Mt Vernon Bos 02108.....	617 367-9931	John	327 Summer Bos 02210.....	617 423-4334	John	40 Westwind Rd Dor 02125.....	617 282-1235	Robert L	175 Richdale Av Cam 02140.....	617 864-1535		
17 739-2662	Cartar Broadcasting Co	20 Park Pl Bos 02116.....	617 423-0210	John	11 Mansfield Bri 02134.....	617 987-2163	June O	329 A Summit Av Dor 02135.....	617 734-6109	Roger	150 St Botolph Bos 02115.....	617 424-6148		
17 879-0030	Cartar & Burgess Consultants Inc	23 East St Cam 02141.....	617 225-0200	John	327 Summer Bos 02210.....	617 423-4334	K	38 Browning Av Dorchester 02124.....	617 265-8456	Royce	44 Concord Av Cam 02138.....	617 491-6115		
17 541-3948	C	228 Faywood Av East Boston 02128.....	617 569-1545	John	40 Westwind Rd Dor 02125.....	617 282-1235	K	18mond Dorchester 02121.....	617 282-1593	1817 241-0418				
17 436-1513	C	359 Harvard Cam 02138.....	617 491-8822	June O	329 A Summit Av Dor 02135.....	617 734-6109	1817 241-0418							
17 569-4119	C	610 Walk Hill Mat 02126.....	617 296-6392	1817 241-0418										
300 569-8782	C & M	43 Burroughs Jam 02130.....	617 524-9558	1817 241-0418										

There must be a great search algorithm behind the scenes.

# Linear Search

# LinSearch: The Spec

```
def LinSearch(x, a) :  
    """ Returns an int k with the  
    property that a[k]==x is True.  
    If no such k exists, then  
    k==-1.  
  
    PreC: a is a nonempty list of  
    ints and x is an int.  
    """
```

# Linear Search

0 1 2 3 4 5 6 7 8 9 10 11

a -> 

86	73	43	35	23	45	42	62	15	25	51	35
----	----	----	----	----	----	----	----	----	----	----	----

k -> 

0
---

x -> 

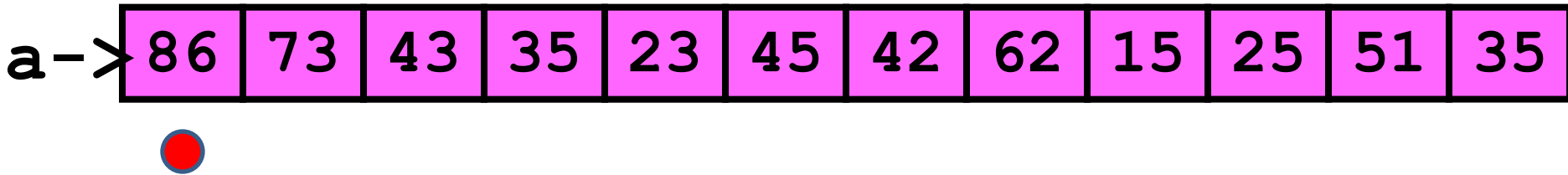
23
----

```
def LinSearch(x, a):  
    for k in range(len(a)):  
        if x == a[k]:  
            return k  
    return -1
```

Walk down the list looking for a match

# Linear Search

0 1 2 3 4 5 6 7 8 9 10 11



k -> 0

x -> 23

```
def LinSearch(x, a):  
    for k in range(len(a)):  
        if x == a[k]:  
            return k  
    return -1
```

Walk down the list looking for a match

# Linear Search

0 1 2 3 4 5 6 7 8 9 10 11

a -> 

86	73	43	35	23	45	42	62	15	25	51	35
----	----	----	----	----	----	----	----	----	----	----	----



k -> 

1
---

x -> 

23
----

```
def LinSearch(x, a):  
    for k in range(len(a)):  
        if x == a[k]:  
            return k  
    return -1
```

Walk down the list looking for a match



# Linear Search

0 1 2 3 4 5 6 7 8 9 10 11

a -> 

86	73	43	35	23	45	42	62	15	25	51	35
----	----	----	----	----	----	----	----	----	----	----	----



k -> 

2
---

x -> 

23
----

```
def LinSearch(x, a):  
    for k in range(len(a)):  
        if x == a[k]:  
            return k  
    return -1
```

Walk down the list looking for a match

# Linear Search

0 1 2 3 4 5 6 7 8 9 10 11

a -> 

86	73	43	35	23	45	42	62	15	25	51	35
----	----	----	----	----	----	----	----	----	----	----	----



k -> 

3
---

x -> 

23
----

```
def LinSearch(x, a):  
    for k in range(len(a)):  
        if x == a[k]:  
            return k  
    return -1
```

Walk down the list looking for a match

# Linear Search

0 1 2 3 4 5 6 7 8 9 10 11

a -> 

86	73	43	35	23	45	42	62	15	25	51	35
----	----	----	----	----	----	----	----	----	----	----	----



k -> 

4
---

x -> 

23
----

```
def LinSearch(x, a):  
    for k in range(len(a)):  
        if x == a[k]: Yup  
            return k  
    return -1
```

Walk down the list looking for a match

# Linear Search

0 1 2 3 4 5 6 7 8 9 10 11

a -> 

86	73	43	35	23	45	42	62	15	25	51	35
----	----	----	----	----	----	----	----	----	----	----	----



k -> 

4
---

x -> 

23
----

```
def LinSearch(x, a):  
    for k in range(len(a)):  
        if x == a[k]:  
            return k All done  
    return -1
```

Walk down the list looking for a match

# Linear Search: No Match Case

0 1 2 3 4 5 6 7 8 9 10 11

a → 

86	73	43	35	23	45	42	62	15	25	51	35
----	----	----	----	----	----	----	----	----	----	----	----



k → 

11
----

x → 

7
---

```
def LinSearch(x, a):  
    for k in range(len(a)):  
        if x == a[k]: Nope  
            return k  
    return -1
```

Walk down the list looking for a match

# Linear Search: No Match Case

0 1 2 3 4 5 6 7 8 9 10 11

a -> 

86	73	43	35	23	45	42	62	15	25	51	35
----	----	----	----	----	----	----	----	----	----	----	----



```
def LinSearch(x, a):  
    for k in range(len(a)):  
        if x == a[k]:  
            return k  
    return -1
```

x -> 

7
---

Return -1 if no match

# Linear Search: While Implementation

```
def LinSearchW(x, a):  
    k=0  
    while k<len(a) and a[k]!=x:  
        k+=1  
    if k==len(a):  
        return -1  
    else:  
        return k
```

# Binary Search

Now we assume that the list  
to be searched is sorted  
from little to big.

```
a = [10, 20, 40, 60, 90]
```

```
a = ['brown', 'dog', 'fox', 'lazy', 'quick', 'the']
```



# Back to Using Phone Books

The Ithaca phone book has 10,000+ entries.

The Manhattan phone book has 1,000,000+ entries. But it does not take 100 x longer to look something up. Why?

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195 Car C

17 566-1282	Cartage New England Inc 26 Allen Ln Norwich 01938.....	978 356-9960	Cartar F 24 Hillcock Ros 02131.....	617 327-1105	Carter Nella E 323 Massachusetts Av Bos 02115.....	617 267-6483
81 447-4101	Cartagema Lydia 18 Jewett Ros 02131.....	617 323-7639	Faye & Ricky 357 Columbus Av Bos 02116.....	617 437-7331	Nicholas S F 115 Randolph Av Mil 02186.....	617 698-5307
00 257-9981	Cartagema Avith 9 Bancroft Row 02119.....	617 442-9780	Francis S 134 Temple W Ros 02132.....	617 323-6781	Nick & Debbie 106 Herrick Rd Newton 02459.....	617 527-0480
17 566-1282	B Hyd 02136.....	617 361-5253	Franklin & Anne 271 Mt Auburn Cam 02138.....	617 354-0798	Nicole.....	617 698-0713
17 364-5188	Jessica 50 Decatur Cha 02139.....	617 241-0152	Fred 42 Hawthorn Jam 02138.....	617 524-3078	Norman G 38 Chickatawbut Dor 02122.....	617 822-1203
361-0380	Lucilla 174 Harvard Cam 02139.....	617 491-5621	Fred 96 Hinckley Rd Mil 02186.....	617 698-1343	P A Crestwood Pk Row 02121.....	617 427-4754
17 566-4548	M 95 Rowe Ros 02131.....	617 323-9713	G & R 8 Verdun Dor 02124.....	617 436-8906	P E 501 E Sixth S Bos 02127.....	617 268-4213
17 628-8248	Melvin 501 Green Cam 02139.....	617 576-1061	G T 27 Franklin Av Som 02145.....	617 623-7121	P L 44 Hutchings Row 02121.....	617 427-9170
17 445-5116	Carte Nicholas 18 Appleton Boston 02116.....	617 695-6996	Gayle 25 Frontenac Dor 02124.....	617 825-0322	P R 91 Byrner Jam 02130.....	617 983-8692
17 822-2982	Cartena O 4 Milford Bos 02118.....	617 338-8219	Geo S 115 Moss Hill Rd Jam 02130.....	617 522-3215	Paul & Constance 134 Anawan Av W Ros 02132.....	617 325-2036
17 427-5712	Carten Thos J Sr & Claire 1 Paradise Rd Mil 02186.....	617 698-6163	George 125 Nashua Bos 02114.....	617 367-9548	Paul E 501 E Sixth St S Bos 02127.....	617 268-4546
17 569-2698	Thomas & Kathleen 50 Thompson Ln Mil 02186.....	617 696-6919	Carter Halliday Associate 107 S Street Bos 02111.....	617 456-1689	Paul M 27 Union Bri 02135.....	617 787-2115
17 667-5190	Cartar A Ros 02131.....	617 327-2257	Carter Harry F 26 Ruess Rk Rd W Ros 02132.....	617 325-5465	Carter Pile Driving Inc 17 Beaver Ct Frammingham 01702.....	617 235-8488
17 569-1417	A Rosbury.....	617 442-5230	Carter Hide Co Inc 146 Summer Bos 02110.....	617 542-7987	Carter Prudence 46 Franklin Watertown 02127.....	617 393-3782
17 338-9110	A 31 Bethune Wy Rosbury 02119.....	617 442-1219	Carter Hilary 61 Harvey Cam 02140.....	617 876-2750	Prudence 46 Franklin Watertown 02127.....	617 926-7063
17 825-9195	A 268 Parkman Av Cambridge 02139.....	617 492-4174	Horace 241 Walnut Av Rosbury 02119.....	617 442-5307	Reginald 106 Brunswick Dorchester 02121.....	617 541-2843
17 296-1593	A M 255 Massachusetts Av Bos 02115.....	617 266-7153	Howard Jr 26 Notre Dame Row 02119.....	617 445-5552	Renee & Andrew 10 Walnut Bos 02108.....	617 720-3765
17 670-2078	Adams 361 Centre St Mil 02186.....	617 698-9074	J Cam.....	617 354-2688	Carter Rice Doud Bulkyer Danton Publishing 163 Main Wilmington 01887.....	800 638-1671
17 623-9001	Alice 108 Kilmarnock Bos 02215.....	617 425-0193	Howard Jr 26 Notre Dame Row 02119.....	617 232-7990	Toll Free-Dial '1' & Then.....	800 619-7447
17 296-4725	Alice 45 Market Cambridge 02139.....	617 945-2711	J 15 Chatham Bro 02446.....	617 730-9483	Toll Free-Dial '1' & Then.....	800 648-7447
17 542-1521	Andrew F 62 Vinal Av Som 02143.....	617 625-7623	J 775 Vna Pkwy West Rosbury 02132.....	617 323-5574	Toll Free-Dial '1' & Then.....	978 988-7447
17 364-5232	Cartar Anne MD 1101 Beacon Bro 02446.....	617 739-1022	Carter J Jacques MD 1 Brookline Pl Bro 02446.....	617 735-8787	Ingalle Cronin 163 Main Wilmington 01887.....	800 638-1673
17 541-5649	Cartar Athens 272 Newbury Boston 02116.....	617 536-6329	Carter J M 1410 Columbia Rd S Bos 02127.....	617 464-1040	Call.....	800 648-7447
17 739-2662	B E 58 Gladeside Av Mat 02126.....	617 296-6911	Carter J H Ornamental Ironworks Call.....	617 436-5353	Call.....	978 988-7447
17 879-0030	Cartar Barbara L MD Tufts-New England Medical Center Bos 02111.....	617 636-0051	Carter J Veal Co 48 Newmarket Sq Rox 02118.....	617 442-1775	Call.....	800 638-1673
17 541-3948	Cartar Becky Bos 02114.....	617 523-4368	Carter James 1573 Cambridge St Cam 02138.....	617 492-1214	Call.....	978 988-7447
17 436-1513	Bernard J 112 Gladstone E Bos 02128.....	617 567-3430	James 182 Fisher Av Rosbury 02120.....	617 739-2193	Call.....	978 988-7447
17 569-4119	Bithiah 25 Medway Dor 02124.....	617 298-8713	James 37 Gold Star Rd Cambridge 02140.....	617 876-8841	Call.....	978 988-7447
300 569-8782	Blake 26 Mt Vernon Bos 02108.....	617 367-9931	Jas L 14 Roseberry Rd Mat 02126.....	617 361-0773	Call.....	978 988-7447
	Cartar Broadcasting Co 20 Park Pl Bos 02116.....	617 423-0210	Jane 114 Adams Rd Newton 02465.....	617 964-0435	Call.....	978 988-7447
	Cartar & Burgess Consultants Inc 23 East St Cam 02141.....	617 225-0200	Jeffrey 41 Warren Av Bos 02116.....	617 426-5994	Call.....	978 988-7447
	C 2000 Commonwealth Av Bri 02135.....	617 782-2118	John 11 Mansfield Bri 02134.....	617 987-2163	Call.....	978 988-7447
	C 228 Faywood Av East Boston 02128.....	617 569-1545	John 327 Summer Bos 02110.....	617 423-4334	Call.....	978 988-7447
	C 359 Harvard Cam 02138.....	617 491-8822	John 40 Westwind Rd Dor 02125.....	617 282-1235	Call.....	978 988-7447
	C 610 Walk Hill Mat 02126.....	617 296-6392	June O 329 A Summit Av Bri 02135.....	617 734-6109	Call.....	978 988-7447
	C & M 43 Burroughs Jam 02130.....	617 524-9558	K 38 Browning Av Dorchester 02124.....	617 265-8456	Call.....	978 988-7447
			K 17 Esmond Dorchester 02121.....	617 282-1593	Call.....	978 988-7447

# Key Idea: Repeated Halving

To Derek Jeter's number...

B = phone book

**while** (B is longer than 1 page):

1. P = middle page of B

2. Let Q be the first name on P

3. **if** 'Jeter' comes before Q:

    Rip away the 2<sup>nd</sup> half of B

**else:**

    Rip away the 1<sup>st</sup> half of B.

Scan remaining page P line-by-line for 'Jeter'

# What Happens to Phone Book Length?

Original: 3000 pages

After 1 rip: 1500 pages

After 2 rips: 750 pages

After 3 rips: 375 pages

After 4 rips: 188 pages

After 5 rips: 94 pages

After 12 rips: 1 page

# Binary Search

The idea of repeatedly halving the size of the "search space" is the main idea behind the method of binary search.

An item in a sorted array of length  $n$  can be located with approximately  $\log_2 n$  comparisons.

$$\log_2 8 = 3 \quad \log_2 64 = 7 \quad \log_2 2^{**k} = k$$

# What is $\log_2(n)$ ?

n	$\text{ceil}(\log_2(n))$
10	4
100	7
1000	10
10000	14
100000	17
1000000	20

# BinSearch: The Spec

```
def BinSearch(x, a) :  
    """ Returns an int k with the  
    property that a[k]==x is True.  
    If no such k exists, then  
    k==-1.  
  
    PreC: a is a nonempty list of  
    ints that is sorted from smallest  
    to largest. x is an int.  
    """
```

Example:

Does this List have an Element  
With Value Equal to 70?

0 1 2 3 4 5 6 7 8 9 10 11

12	15	33	35	42	45	51	62	73	75	86	98
----	----	----	----	----	----	----	----	----	----	----	----

# Let's Look For x in a

0 1 2 3 4 5 6 7 8 9 10 11



L: 0

Mid: 5

R: 11

a[Mid] <= x ?????

x: 70

Mid = (L+R) / 2



# The Midpoint Computations

L	R	$(L+R) / 2$
0	11	5
2	6	4
1	100	50

# Let's Look For $x$ in $a$

0 1 2 3 4 5 6 7 8 9 10 11

$a \rightarrow$ 

12	15	33	35	42	45	51	62	73	75	86	98
----	----	----	----	----	----	----	----	----	----	----	----



L: 

0
---

$a[\text{Mid}] \leq x$  ????

Mid: 

5
---

R: 

11
----

x: 

70
----

# Let's Look For $x$ in $a$

0 1 2 3 4 5 6 7 8 9 10 11



L: 0

Mid: 5

R: 11

$a[\text{Mid}] \leq x$

Yes!

$x$ : 70

So throw away  
The "left half"

# Let's Look For x in a

0 1 2 3 4 5 6 7 8 9 10 11

a →

12	15	33	35	42	45	51	62	73	75	86	98
----	----	----	----	----	----	----	----	----	----	----	----



L: 0

Mid: 5

R: 11

x: 70

$a[\text{Mid}] \leq x$

Yes!

So throw away  
The "left half"

# Let's Look For x in a

0 1 2 3 4 5 6 7 8 9 10 11

a →

12	15	33	35	42	45	51	62	73	75	86	98
----	----	----	----	----	----	----	----	----	----	----	----



L: 0

Mid: 5

R: 11

$a[\text{Mid}] \leq x$

Revise L and Mid

x: 70

# Let's Look For x in a

0 1 2 3 4 5 6 7 8 9 10 11

a →

12	15	33	35	42	45	51	62	73	75	86	98
----	----	----	----	----	----	----	----	----	----	----	----



L: 5

a[Mid] <= x ???

Mid: 8

R: 11

x: 70

# Let's Look For $x$ in $a$

0 1 2 3 4 5 6 7 8 9 10 11



L: 5

Mid: 8

R: 11

$a[\text{Mid}] \leq x$

No

$x$ : 70

So throw away the  
"right half"

# Let's Look For $x = 70$

0 1 2 3 4 5 6 7 8 9 10 11

a →

12	15	33	35	42	45	51	62	73	75	86	98
----	----	----	----	----	----	----	----	----	----	----	----



L: 5

Mid: 8

R: 11

$a[\text{Mid}] \leq x$

Revise R and Mid

x: 70



# Let's Look For $x = 70$

0 1 2 3 4 5 6 7 8 9 10 11

a →

12	15	33	35	42	45	51	62	73	75	86	98
----	----	----	----	----	----	----	----	----	----	----	----



L: 5

Mid: 6

R: 8

$a[\text{Mid}] \leq x$

Revise R and Mid

x: 70

# Let's Look For x in a

0 1 2 3 4 5 6 7 8 9 10 11

a →

12	15	33	35	42	45	51	62	73	75	86	98
----	----	----	----	----	----	----	----	----	----	----	----



L: 5

a[Mid] <= x ????

Mid: 6

R: 8

x: 70

# Let's Look For x in a

0 1 2 3 4 5 6 7 8 9 10 11



L: 5

$a[\text{Mid}] \leq x$

Mid: 6

Yes

R: 8

x: 70

Throw away the  
Left half

# Let's Look For x in a

0 1 2 3 4 5 6 7 8 9 10 11

a →

12	15	33	35	42	45	51	62	73	75	86	98
----	----	----	----	----	----	----	----	----	----	----	----



L: 6

Mid: 7

R: 8

$a[\text{Mid}] \leq x$

Yes

x: 70

# Let's Look For x in a

0 1 2 3 4 5 6 7 8 9 10 11

a ->

12	15	33	35	42	45	51	62	73	75	86	98
----	----	----	----	----	----	----	----	----	----	----	----



L: 6

Mid: 7

R: 8

x: 70

$a[\text{Mid}] \leq x$

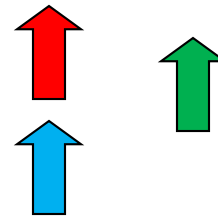
Throw away the  
left half

# Let's Look For $x$ in $a$

0 1 2 3 4 5 6 7 8 9 10 11

$a \rightarrow$

12	15	33	35	42	45	51	62	73	75	86	98
----	----	----	----	----	----	----	----	----	----	----	----



L:

6

Mid:

7

R:

8

$x$ :

70

Done! At this point we just compare  $x$  with  $a[L]$  and  $a[L+1]$ .

# What We Just Did

```
L = 0
R = len(a) - 1
while R - L > 1:
    # a[L] <= x <= a[R]
    Mid = (L + R) / 2
    if x <= a[mid]:
        R = Mid
    else:
        L = Mid
```

A Loop  
Invariant

Note that  $a[L] \leq x \leq a[R]$  remains True throughout the loop

# What We Just Did

```
L = 0
R = len(a) - 1
while R - L > 1:
    # a[L] <= x <= a[R]
    Mid = (L + R) / 2
    if x <= a[mid]:
        R = Mid
    else:
        L = Mid
```

What is the situation when the loop terminates?



# What We Just Did

```
L = 0
R = len(a) - 1
while R - L > 1:
    # a[L] <= x <= a[R]
    Mid = (L + R) / 2
    if x <= a[mid]:
        R = Mid
    else:
        L = Mid
```

$R - L \leq 1$  implies  $R = L + 1$

# After the Loop Ends



This is True:  $a[L] \leq x \leq a[L+1]$

# After the Loop Ends



```
if x==a[L]:  
    return L  
elif x==a[L+1]:  
    return L+1  
else:  
    return -1
```

# Measuring Execution Time

We now have two ways to search a list:

`LinSearch(x, a)`

`BinSearch(x, a)`

Intuition: `BinSearch` much faster.

Can we quantify this with a "stop watch"?

# The `timeit` Module

This module can be used to time how long it takes to execute a chunk of code.

Typical chunk = some function of interest.

This is called benchmarking.

# Benchmarking

Let's benchmark `LinSearch(x, a)` and `BinSearch(x, a)`.

Compare how long it takes when `len(a)` equals 1000, 10000, 100000, and 1000000.

Our intuition tells us that as `len(a)` increases, `BinSearch` will be dramatically faster.

# BinSearch vs LinSearch

n	tBin	tLin	tLinW
1000	0.0007	0.0064	0.0119
10000	0.0009	0.0668	0.1203
100000	0.0011	0.8296	1.2082
1000000	0.0015	17.7388	13.9341

tBin = time for BinSearch

tLin = time for LinSearch (for loop version)

tLinW = time for LinSearch (while-loop version)

# BinSearch vs LinSearch

n	tLin/tBin
1000	9
10000	74
100000	754
1000000	7095

Reporting ratios is more illuminating since we do not really care about the time units in this informal comparison



# Using the `timeit` Module

We show how this module was use to get the results on the previous slides.

Our `LinSearch` vs `BinSearch` example is very typical: is one function faster than another?

# A Benchmarking Framework

```
from timeit import *
```

```
S = """
```

Set-up code

```
"""
```

```
B = """
```

Code to Benchmark

```
"""
```

```
p = 10; m = 100
```

```
t = min(Timer(B, setup=S) . repeat(p, m) )
```

Yes, these are doc strings.

# The Set-Up and Bench Codes

```
from random import randint as randi
from ShowSearch import BinSearch
n = 10000
s = [randi(0,10*n) for i in range(n)]
s.sort()
x = s[n/2]
```

```
k=BinSearch(x,s)
```

The set-up code is run once.

It is not timed.

It just sets up the code to be timed.

# A Benchmarking Framework

```
from timeit import *
```

```
S = """
```

```
    Set-up code
```

```
    """
```

```
B = """
```

```
    Code to Benchmark
```

```
    """
```

```
p = 10; m = 100
```

```
t = min(Timer(B, setup=S).repeat(p, m))
```

An “experiment” consists of running the blue code  $m$  times.

The stopwatch will time how long it takes to do one experiment

Larger values necessary if the blue code executes very quickly

# A Benchmarking Framework

```
from timeit import *
```

```
S = """
```

Set-up code

```
"""
```

```
B = """
```

Code to Benchmark

```
"""
```

```
p = 10; m = 100
```

```
t = min(Timer(B, setup=S).repeat(p, m))
```

Timer returns a length-p list. Each element is the stopwatch time for 1 experiment

This helps control for other stuff that may be running on your computer.

# A Benchmarking Framework

```
from timeit import *
```

```
S = """
```

Set-up code

```
"""
```

```
B = """
```

Code to Benchmark

```
"""
```

```
p = 10; m = 100
```

```
t = min(Timer(B, setup=S).repeat(p, m))
```

In general, it is best to take the minimum as the most reliable. The benchmark time is assigned to t

This helps control for other stuff that may be running on your computer.

# Why Benchmarking is Important

Confirms/refutes what our intuition might say about efficiency.

Makes us sensitive to the various issues that affect efficiency.

Steers us away from simplistic comparisons of different methods that can be used on the same problem.

# MergeSort

Binary Search is an example of a "divide and conquer" approach to problem solving.

A method for sorting a list that features this strategy is MergeSort



# Motivation

You are asked to sort a list but you have two "helpers": H1 and H2.

## Idea:

1. Split the list in half and have each helper sort one of the halves.
2. Then merge the two sorted lists into a single larger list.

This idea can be repeated if H1 has two helpers and H2 has two helpers.

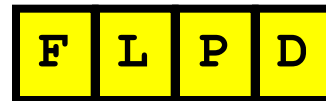
# Subdivide the Sorting Task

H	E	M	G	B	K	A	Q	F	L	P	D	R	C	J	N
---	---	---	---	---	---	---	---	---	---	---	---	---	---	---	---

H	E	M	G	B	K	A	Q
---	---	---	---	---	---	---	---

F	L	P	D	R	C	J	N
---	---	---	---	---	---	---	---

# Subdivide Again



# And Again



H E M G

B K A Q

F L P D

R C J N

H E

M G

B K

A Q

F L

P D

R C

J N

# And One Last Time

--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--

--	--	--	--	--	--	--	--

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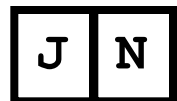
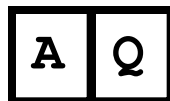
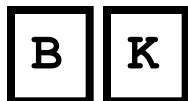
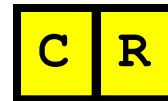
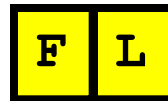
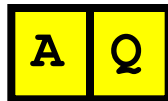
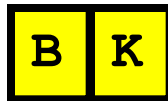
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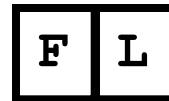
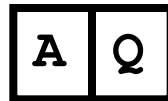
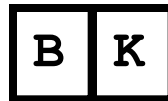
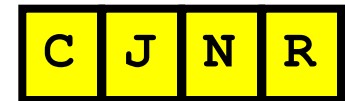
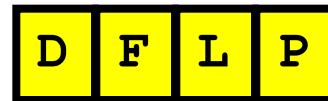
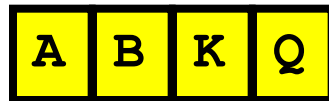
--	--

H	E	M	G	B	K	A	Q	F	L	P	D	R	C	J	N
---	---	---	---	---	---	---	---	---	---	---	---	---	---	---	---

# Now Merge



# And Merge Again



# And Again



A	B	E	G	H	K	M	Q
---	---	---	---	---	---	---	---

C	D	F	J	L	N	P	R
---	---	---	---	---	---	---	---

E	G	H	M
---	---	---	---

A	B	K	Q
---	---	---	---

D	F	L	P
---	---	---	---

C	J	N	R
---	---	---	---



# And One Last Time

A	B	C	D	E	F	G	H	J	K	L	M	N	P	Q	R
---	---	---	---	---	---	---	---	---	---	---	---	---	---	---	---

A	B	E	G	H	K	M	Q
---	---	---	---	---	---	---	---

C	D	F	J	L	N	P	R
---	---	---	---	---	---	---	---

Done!

A	B	C	D	E	F	G	H	J	K	L	M	N	P	Q	R
---	---	---	---	---	---	---	---	---	---	---	---	---	---	---	---

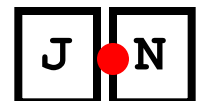
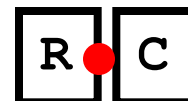
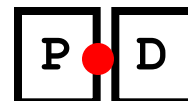
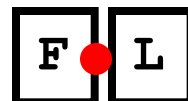
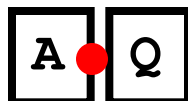
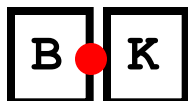
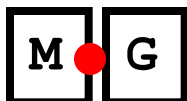
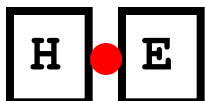
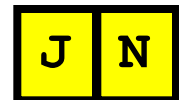
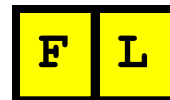
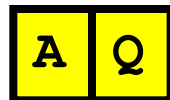
# Done!

A	B	C	D	E	F	G	H	J	K	L	M	N	P	Q	R
---	---	---	---	---	---	---	---	---	---	---	---	---	---	---	---

Let's write a function to do this making use of

```
def Merge(x,y):  
    """ Returns a float list that is the  
    merge of sorted lists x and y.  
  
    PreC: x and y are lists of floats  
    that are sorted from small to big.  
    """
```

# 8 Merges Producing length-2 lists



# Handcoding the $n = 16$ case

**A0 = Merge (a [0] , a [1] )**

**A1 = Merge (a [2] , a [3] )**

**A2 = Merge (a [4] , a [5] )**

**A3 = Merge (a [6] , a [7] )**

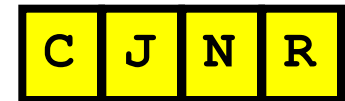
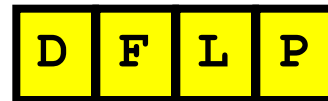
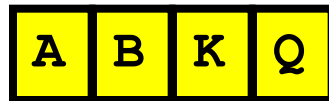
**A4 = Merge (a [8] , a [9] )**

**A5 = Merge (a [10] , a [11] )**

**A6 = Merge (a [12] , a [13] )**

**A7 = Merge (a [14] , a [15] )**

# 4 Merges Producing Length-4 lists



# Handcoding the $n = 16$ case

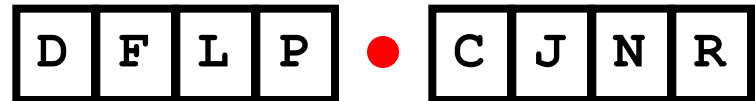
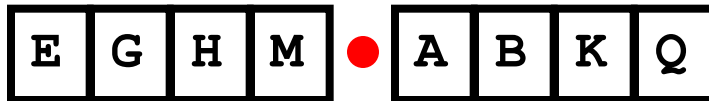
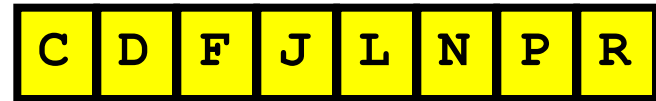
**B0 = Merge (A0 , A1)**

**B1 = Merge (A2 , A3)**

**B2 = Merge (A4 , A5)**

**B3 = Merge (A6 , A7)**

# 2 Merges Producing Length-8 Lists





# Handcoding the $n = 16$ case

**C0 = Merge (B0 , B1)**

**C1 = Merge (B2 , B3)**

# 1 Merge Producing a Length-16 List

A	B	C	D	E	F	G	H	J	K	L	M	N	P	Q	R
---	---	---	---	---	---	---	---	---	---	---	---	---	---	---	---

A	B	E	G	H	K	M	Q
---	---	---	---	---	---	---	---



C	D	F	J	L	N	P	R
---	---	---	---	---	---	---	---

# All Done!

`D0 = Merge (C0 , C1)`

For general  $n$ , it can be handled using recursion.

# Recursive Merge Sort

```
def MergeSort(a):  
    n = length(a)  
    if n==1:  
        return a  
    else:  
        m = n/2  
        u0 = list(a[:m])  
        u1 = list(a[m:])  
        y0 = MergeSort(u0) ←  
        y1 = MergeSort(u1) ←  
        return Merge(y0, y1)
```

A function  
can call  
itself!