

Module 28

Searching & Sorting



Acknowledgement

Walker M. White
Cornell University

Linear Search

```
def linear_search(v,b):  
    """Returns: first occurrence of v in b; -1 if not found  
  
    Parameter v: The value to search for  
    Precondition: None (v can be any value)  
  
    Parameter b: The sequence to search for  
    Precond: b is a sequence  
    """
```

Linear Search

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```

How many entries do
we have to look at?

Linear Search

```
def linear_search(v,b):  
    """Returns: first occurrence of v in b (-1 if not found)  
    Precond: b a list of number, v a number  
    """  
  
    # Loop variable  
    i = 0  
    while i < len(b) and b[i] != v:  
        i = i + 1  
  
    if i == len(b): # not found  
        return -1  
    return i
```

Linear Search

```
def linear_search(v,b):  
    """Returns: first occurrence of v in b (-1 if not found)  
    Precond: b a list of number, v a number  
    """  
  
    # Loop variable  
    i = len(b) - 1  
    while i >= 0 and b[i] != v:  
        i = i - 1  
  
    # Equals -1 if not found  
    return i
```

Linear Search

```
def linear_search(v,b):  
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How many entries do
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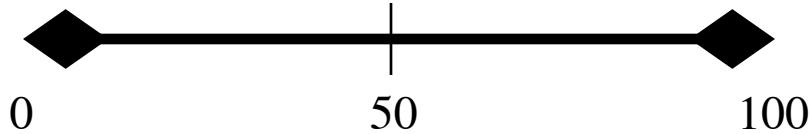
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How many entries do
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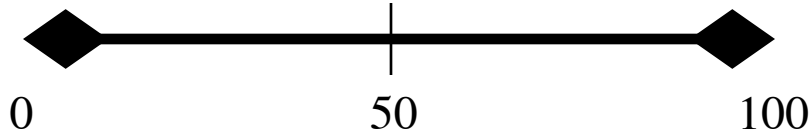
All of them!

Is There a Better Way?



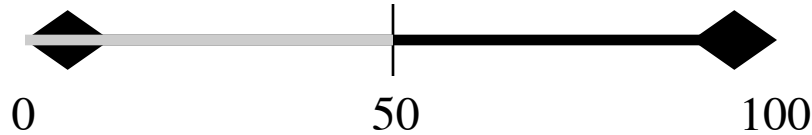
- Thinking of number 0..100
 - You get to guess number
 - I tell you higher or lower
 - Continue until get it right
- **Goal:** Keep # guesses low
 - Use my answers to help
- **Strategy?**

Is There a Better Way?



- Thinking of number 0..100
 - You get to guess number
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 - Use my answers to help
- **Strategy?**
 - Start guess in the middle
 - Answer eliminates half
 - Go to middle of remaining

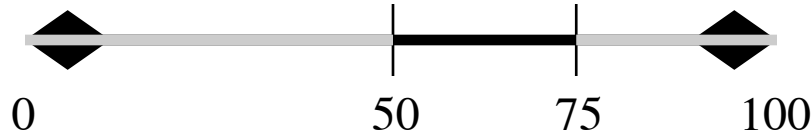
Is There a Better Way?



Higher!

- Thinking of number 0..100
 - You get to guess number
 - I tell you higher or lower
 - Continue until get it right
- **Goal:** Keep # guesses low
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- **Strategy?**
 - Start guess in the middle
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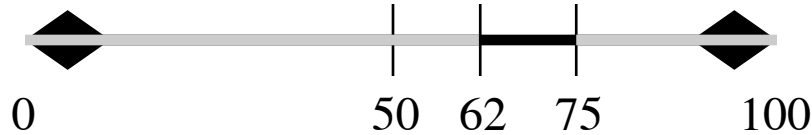
Is There a Better Way?



Lower!

- Thinking of number 0..100
 - You get to guess number
 - I tell you higher or lower
 - Continue until get it right
- **Goal:** Keep # guesses low
 - Use my answers to help
- **Strategy?**
 - Start guess in the middle
 - Answer eliminates half
 - Go to middle of remaining

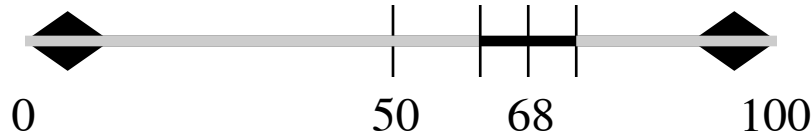
Is There a Better Way?



Higher!

- Thinking of number 0..100
 - You get to guess number
 - I tell you higher or lower
 - Continue until get it right
- **Goal:** Keep # guesses low
 - Use my answers to help
- **Strategy?**
 - Start guess in the middle
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 - Go to middle of remaining

Is There a Better Way?



Correct!

- Thinking of number 0..100
 - You get to guess number
 - I tell you higher or lower
 - Continue until get it right
- **Goal:** Keep # guesses low
 - Use my answers to help
- **Strategy?**
 - Start guess in the middle
 - Answer eliminates half
 - Go to middle of remaining

Binary Search

```
def binary_search(v,b):
```

```
    """Returns: an occurrence of v in b
```

```
    Parameter v: The value to search for
```

```
    Precondition: None (v can be any value)
```

```
    Parameter b: The sequence to search for
```

```
    Precond: b is a sorted sequence
```

```
    """
```

Binary Search

```
def b_search(v,b):  
    # Loop variable(s)  
    i = 0  
    j = len(b)  
    mid = (i+j)//2  
    while i < j:  
        if b[mid] < v:  
            i = mid + 1  
        else:  
            j = mid  
        mid = (i+j)//2  
    if i < len(b) and b[i] == v:  
        return i
```

Requires that the
data is sorted!

But few checks!

Observation About Sorting

- Sorting data can speed up searching
 - Sorting takes time, but do it once
 - Afterwards, can search many times
- Not just searching. Also speeds up
 - Duplicate elimination in data sets
 - Data compression
 - Physics computations in computer games
- Why it is a major area of computer science

The Sorting Challenge

- **Given:** A list of numbers
- **Goal:** Sort those numbers using only
 - Iteration (while-loops or for-loops)
 - Comparisons ($<$ or $>$)
 - Assignment statements
- **Why?** For proper **analysis**.
 - Methods/functions come with hidden costs
 - Everything above has no hidden costs
 - Each comparison or assignment is “1 step”

This Requires Some Notation



- As the list is sorted...
 - Part of the list **will** be sorted
 - Part of the list will **not** be sorted
- Need a way to refer to portions of the list
 - Notation to refer to sorted/unsorted parts
- And have to do it **without** slicing!
 - Slicing makes a copy
 - Want to sort original list, not a copy

This Requires Some Notation

- As the list is sorted...

- Part of the list **will** be sorted
- Part of the list **will not** be sorted

- Need a way to...

- Notation to...

But we will not be
very formal!

- And have to do it **without** slicing!

- Slicing makes a copy
- Want to sort original list, not a copy

Terminology: Range Notation

- $m..n$ is a range containing $n+1-m$ values
 - $2..5$ contains 2, 3, 4, 5. Contains $5+1 - 2 = 4$ values
 - $2..4$ contains 2, 3, 4. Contains $4+1 - 2 = 3$ values
 - $2..3$ contains 2, 3. Contains $3+1 - 2 = 2$ values
 - $2..2$ contains 2. Contains $2+1 - 2 = 1$ values
 - $2..1$ contains ???

Terminology: Range Notation



What does 2..**1** contain?

A: nothing

B: 2,1

C: 1

D: 2

E: something else

Terminology: Range Notation



What does 2..**1** contain?

A: nothing

B: 2,1

C: 1

D: 2

E: something else

Terminology: Range Notation

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 - $2..4$ contains 2, 3, 4. Contains $4+1 - 2 = 3$ values
 - $2..3$ contains 2, 3. Contains $3+1 - 2 = 2$ values
 - $2..2$ contains 2. Contains $2+1 - 2 = 1$ values
 - $2..1$ contains ???
- The notation $m..n$, always implies that $m \leq n+1$
 - So you can assume that even if we do not say it
 - If $m = n+1$, the range has 0 values

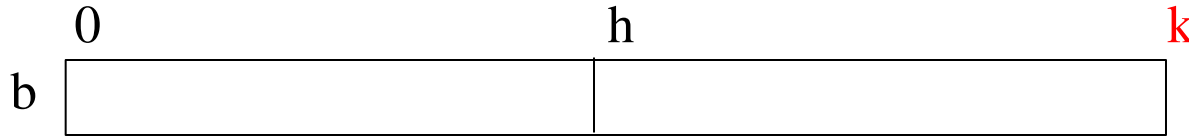
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 - $2..1$ contains ???
- The notation $m..n$, always implies that $m \leq n+1$
 - So you can assume that even if we do not say it
 - If $m = n+1$, the range has 0 values

Not the same as
`range(m,n)`

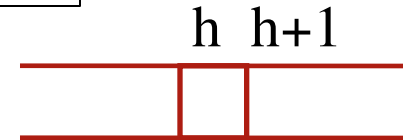
Horizontal Notation

- Want a pictorial way to visualize this sorting
 - Represent the list as long rectangle
 - We saw this idea in divide-and-conquer



- Do **not** show individual boxes

- Just dividing lines between regions
- Label dividing lines with indices
- But index is either left or right of dividing line

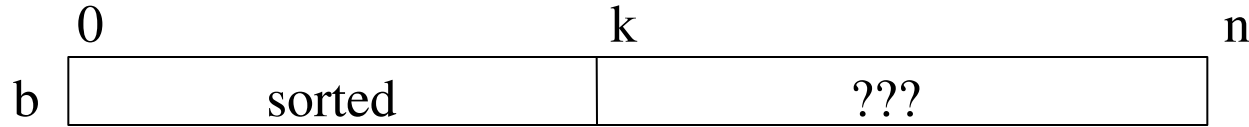


$$(h+1) - h = 1$$

Horizontal Notation

- Label regions with properties

- **Example:** Sorted or ???



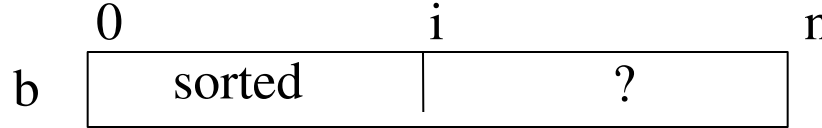
- $b[0..k-1]$ is sorted
 - $b[k..n-1]$ **unknown** (might be sorted)
- Picture allows us to track progress

Start: b

Goal: b

In-Progress: b

Insertion Sort



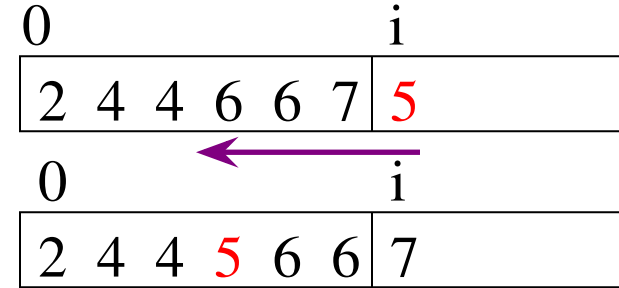
$i = 0$

while $i < n$:

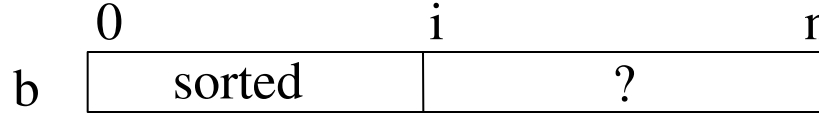
Push $b[i]$ down into its

sorted position in
 $b[0..i]$

$i = i + 1$



Insertion Sort



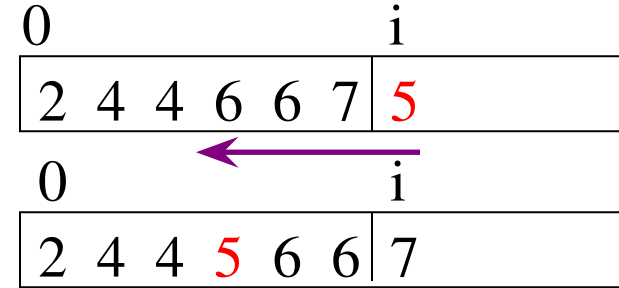
$i = 0$

while $i < n$:

Push $b[i]$ down into its

sorted position in
 $b[0..i]$

$i = i + 1$



Remember the restrictions!

Insertion Sort: Moving into Position



`i = 0`

`while i < n:`

`push_down(b,i)`

`i = i+1`

`def push_down(b, i):`

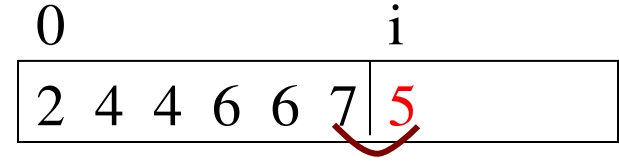
`j = i`

`while j > 0:`

`if b[j-1] > b[j]:`

`swap(b, j-1, j)`

`j = j-1`



swap shown in the
lecture about lists

Insertion Sort: Moving into Position

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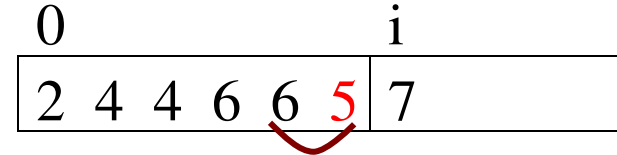
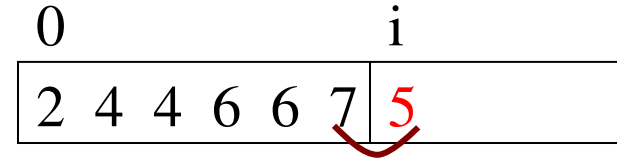
`while j > 0:`

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Insertion Sort: Moving into Position

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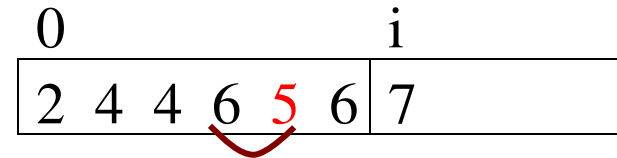
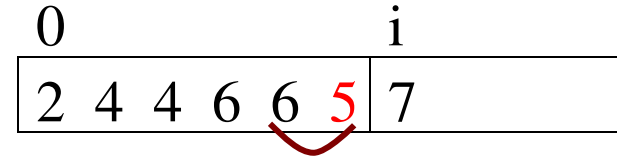
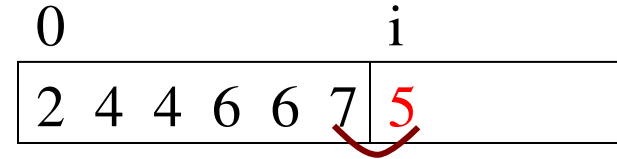
while $j > 0$:

if $b[j-1] > b[j]$:

 swap(b, j-1, j)

$j = j - 1$

swap shown in the
lecture about lists

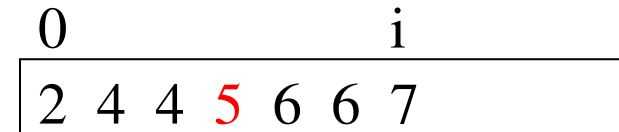
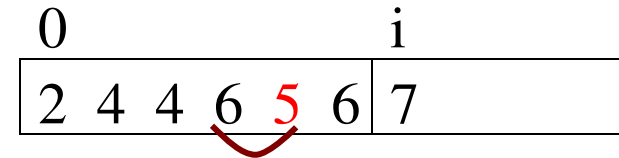
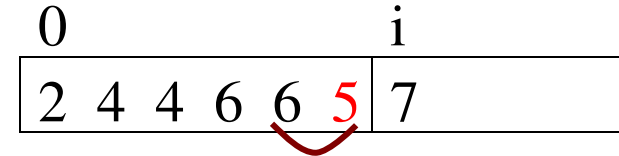
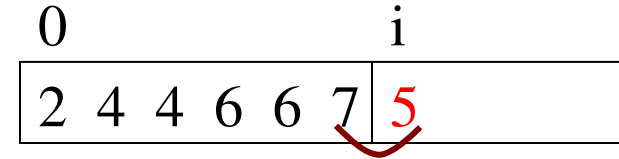


Insertion Sort: Moving into Position

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i = 0
while i < n:
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    i = i + 1

def push_down(b, i):
    j = i
    while j > 0:
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```

swap shown in the
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The Importance of Helper Functions



```
i = 0
while i < n:
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def push_down(b, i):
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    while j > 0:
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        j = j-1
```

VS

```
i = 0
while i < n:
    j = i
    while j > 0:
        if b[j-1] > b[j]:
            temp = b[j]
            b[j] = b[j-1]
            b[j-1] = temp
        j = j - 1
    i = i + 1
```

The Importance of Helper Functions



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i = 0
while i < n:
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            b[j-1] = temp
        j = j - 1
    i = i + 1
```

Can you
understand
all this code
below?

Measuring Performance

- Performance is a tricky thing to measure
 - Different computers run at different speeds
 - Memory also has a major effect as well
- Need an independent way to measure
 - Measure in terms of “basic steps”
 - **Example:** Searching counted # of checks
- For sorting, we measure in terms of **swaps**
 - Three assignment statements
 - Present in all sorting algorithms

Insertion Sort: Performance

```
def push_down(b, i):  
    """Push value at position i  
    into sorted position in  
    b[0..i-1]"""  
    j = i  
    while j > 0:  
        if b[j-1] > b[j]:  
            swap(b, j-1, j)  
        j = j-1
```

- $b[0..i-1]$: i elements
- Worst case:
 - $i = 0$: 0 swaps
 - $i = 1$: 1 swap
 - $i = 2$: 2 swaps
- Pushdown is in a loop
 - Called for i in $0..n$
 - i swaps each time

Total Swaps: $0 + 1 + 2 + 3 + \dots (n-1) = (n-1)*n/2 = (n^2-n)/2$

Insertion Sort: Performance

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def push_down(b, i):  
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    while j > 0:  
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            swap(b, j-1, j)  
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```

Insertion sort is
an n^2 algorithm

- $b[0..i-1]$: i elements
- Worst case:
 - $i = 0$: 0 swaps
 - $i = 1$: 1 swap
 - $i = 2$: 2 swaps
- Pushdown is in a loop
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Total Swaps: $0 + 1 + 2 + 3 + \dots (n-1) = (n-1)*n/2 = (n^2-n)/2$

Algorithm “Complexity”

- **Given:** a list of length n and a problem to solve
- **Complexity:** *rough* number of steps to solve worst case
- Suppose we can compute 1000 operations a second

Complexity	$n=10$	$n=100$	$n=1000$
$\log n$	0.003 s	0.006 s	0.01 s
n	0.01 s	0.1 s	1 s
$n \log n$	0.016 s	0.32 s	4.79 s
n^2	0.1 s	10 s	16.7 m
n^3	1 s	16.7 m	11.6 d
2^n	1 s	4×10^{19} y	3×10^{290} y

Algorithm “Complexity”

- **Given:** a list of length n and a problem to solve
- **Complexity:** *rough* number of steps to solve worst case
- Suppose we can compute 1000 operations a second

Complexity	$n=10$	$n=100$	$n=1000$
$\log n$	Binary Search	0.006 s	0.01 s
n	Linear Search	0.1 s	1 s
$n \log n$	0.016 s	0.32 s	4.79 s
n^2	Insertion Sort	10 s	16.7 m
n^3	1 s	16.7 m	11.6 d
2^n	1 s	4×10^{19} y	3×10^{290} y

Insertion Sort is Not Great

- Typically n^2 is okay, but not great
 - Will perform horribly on large data
 - Very bad when performance critical (games)
- We would like to do better than this
 - Can we get n swaps (**no**)?
 - How about $n \log n$ (**maybe**)
- This will require a new algorithm
 - Let's return to horizontal notation

A New Algorithm

Start: b $\begin{array}{|c|} \hline 0 \qquad \qquad \qquad n \\ \hline \end{array}$ $\begin{array}{|c|} \hline ? \\ \hline \end{array}$

Goal: b $\begin{array}{|c|} \hline 0 \qquad \qquad \qquad n \\ \hline \end{array}$ $\begin{array}{|c|} \hline \text{sorted} \\ \hline \end{array}$

In-Progress: b $\begin{array}{|c|} \hline 0 \qquad \qquad \qquad i \qquad \qquad \qquad n \\ \hline \end{array}$ $\begin{array}{|c|} \hline \text{sorted, } \leq b[i.. n-1] \qquad \geq b[0..i-1] \\ \hline \end{array}$

First segment always
contains smaller values

Selection Sort

$i = 0$

	0		i		n
b	sorted, $\leq b[i..]$			$\geq b[0..i-1]$	

while $i < n$:

Find minimum in
 $b[i..n]$

						i					n
2	4	4	6	6		8	9	9	7	8	9

						i					n
2	4	4	6	6		7	9	9	8	8	9

Swap it with position i

							i				n
2	4	4	6	6	7		9	9	8	8	9

$i = i + 1$

Remember the restrictions!

Selection Sort

How fast is this?

$i = 0$

while $i < n$:

$j = \text{index of min of } b[i..n-1]$

$\text{swap}(b, i, j)$

$i = i + 1$

					i						n
2	4	4	6	6		8	9	9	7	8	9

					i						n
2	4	4	6	6		7	9	9	8	8	9

							i					n
2	4	4	6	6	7			9	9	8	8	9

Selection Sort

This is also n^2 !

$i = 0$

while $i < n$:

$j = \text{index of min of } b[i..n-1]$

swap(b, i, j)

$i = i + 1$

This is n steps

						i					n				
	2	4	4	6	6	8	9	9	7	8	9				

						i					n				
	2	4	4	6	6	7	9	9	8	8	9				

							i					n				
	2	4	4	6	6	7	9	9	8	8	9					

What is the Problem

- Both insertion, selection sort are nested loops
 - Outer loop over each element to sort
 - Inner loop to put next element in place
 - Each loop is n steps. $n \times n = n^2$
- To do better we must *eliminate* a loop
 - But with what?

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What is the Problem

- Both insertion, selection sort are nested loops
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 - Inner loop to put next element in place
 - Each loop is n steps. $n \times n = n^2$
- To do better we must *eliminate* a loop
 - But with what? **Recursion!**
- But to do this we have to step back
 - Need to introduce an intermediate algorithm

The Problem Statement

- Given a list $b[h..k]$ with some value x in $b[h]$:

Start: b

h	x	?	k
-----	-----	---	-----

- Swap elements of $b[h..k]$ to get this answer

Goal: b

h	$\leq x$	i	x	$i+1$	$\geq x$	k
-----	----------	-----	-----	-------	----------	-----

In-Progress: b

h	$\leq x$	i	x	j	?	$\geq x$	k
-----	----------	-----	-----	-----	---	----------	-----

Indices h, k important!
Might partition only part

Partition Algorithm

- Given a list $b[h..k]$ with some value x in $b[h]$:

Start: b

h	x	$?$	k
-----	-----	-----	-----

- Swap elements of $b[h..k]$ to get this answer

Goal: b

h	$\leq x$	x	$\geq x$	k
-----	----------	-----	----------	-----

Change: b

h	3	5	4	1	6	2	3	8	1	k
-----	-----	---	---	---	---	---	---	---	---	-----

into b

h	1	2	1	3	5	4	6	3	8	k
-----	---	---	---	-----	---	---	---	---	---	-----

or b

h	1	2	3	1	3	4	5	6	8	k
-----	---	---	---	---	-----	---	---	---	---	-----

• x is called the pivot value

- x is not a program variable
- denotes value initially in $b[h]$

Partition Algorithm Implementation



SITARE
University

partition(b,h,k), not partition(b[h:k+1])

Remember, slicing always copies the list!

We want to partition the **original** list

Partition Algorithm Implementation



SITARE
University

$\leq x$			$\geq x$		
h			k		
i			j		
$i+1$			j		
1	2	3	1	5	0
6	3	8			

Partition Algorithm Implementation



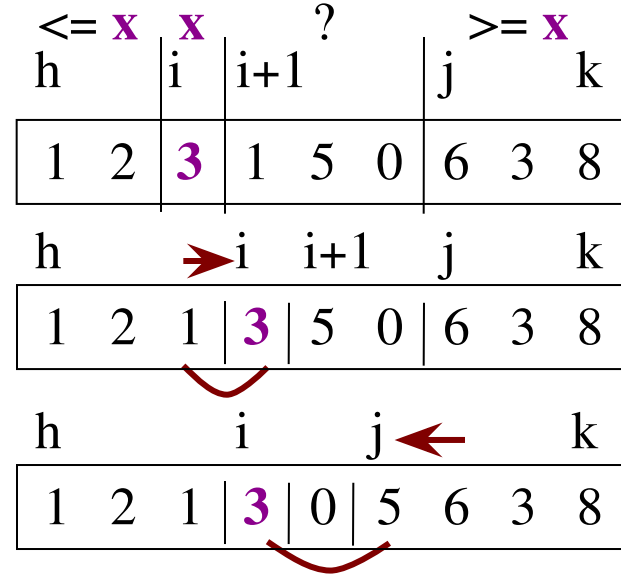
SITARE
University

$\leq x$			$\geq x$?		
h			i	i+1				j k
1	2	3	1	5	0	6	3	8

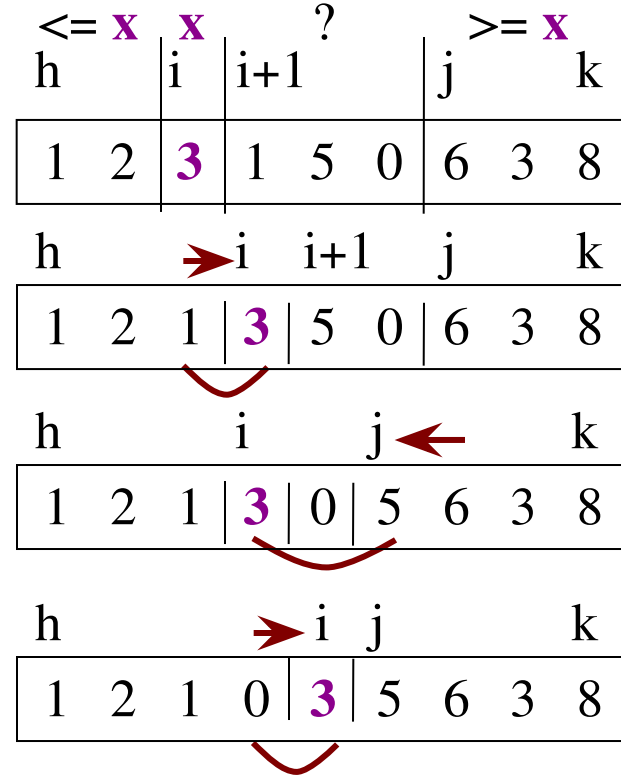
h			\rightarrow i			i+1	j	k
1	2	1	3	5	0	6	3	8



Partition Algorithm Implementation



Partition Algorithm Implementation

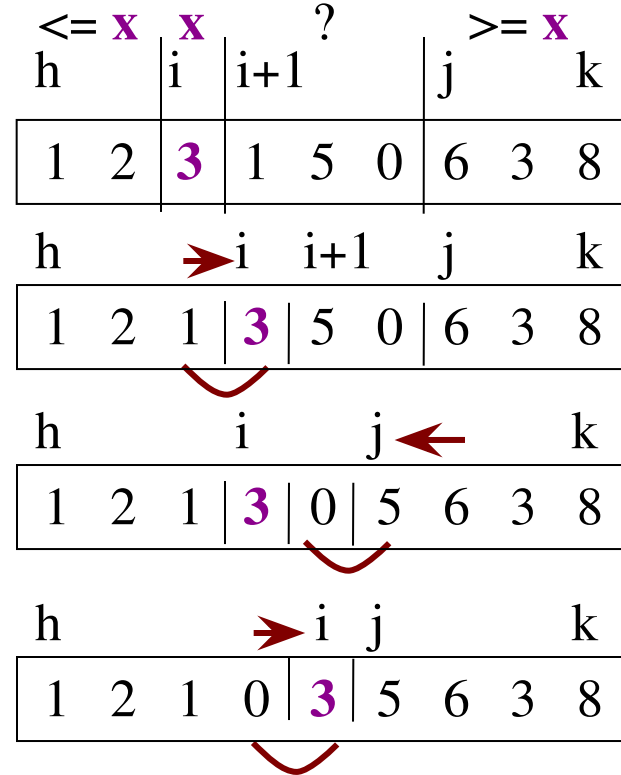


Partition Algorithm Implementation



```
def partition(b, h, k):
```

```
    """ Returns the new position of
    pivot in partitioned list b[h..k].
    Partition list b[h..k] around a
    pivot x = b[h] """
```

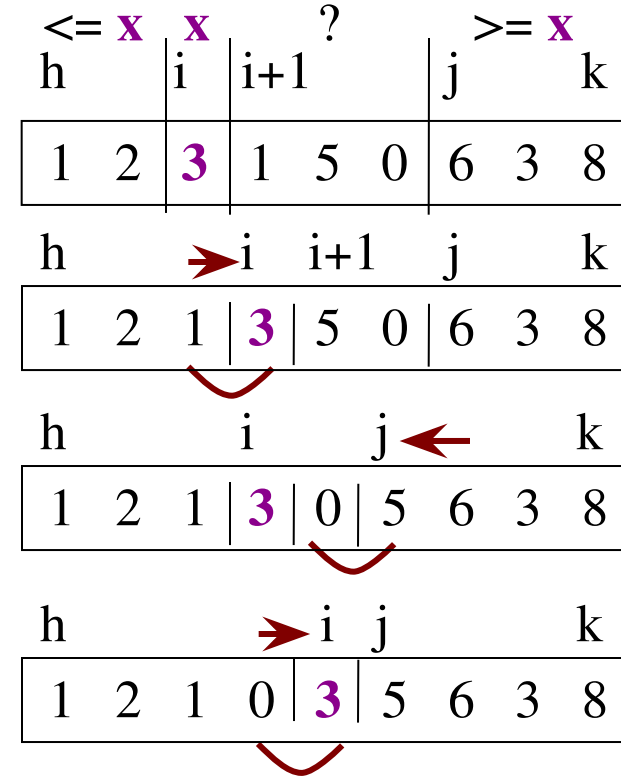


Partition Algorithm Implementation

```
def partition(b, h, k):
    """Partition list b[h..k] around a pivot x = b[h]"""
    i = h; j = k+1; x = b[h]

    while i < j-1:
        if b[i+1] >= x:
            # Move to end of block.
            swap(b, i+1, j-1)
            j = j - 1
        else: # b[i+1] < x
            swap(b, i, i+1)
            i = i + 1

    return i
```



Why is this Useful?

- Will use this algorithm to replace inner loop
 - The inner loop costs us n swaps every time
- Can this reduce the number of swaps?
 - Worst case is $k-h$ swaps
 - This is n if partitioning the whole list
 - But less if only partitioning part
- **Idea:** Break up list and partition only part?
 - This is **Divide-and-Conquer!**

Sorting with Partitions

- Given a list segment $b[h..k]$ with some value x in $b[h]$:


Start: b

h	x	$?$	k
-----	-----	-----	-----

- Swap elements of $b[h..k]$ to get this answer

Goal: b

h	$\leq x$	i	x	$i+1$	$\geq x$	k
-----	----------	-----	-----	-------	----------	-----



Partition Recursively

Recursive partitions = sorting

- Called **QuickSort** (why???)
- Popular, fast sorting technique

Sorting with Partitions

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Goal: b

h	y	$?$	i	$i+1$	x	$\geq x$	k
-----	-----	-----	-----	-------	-----	----------	-----



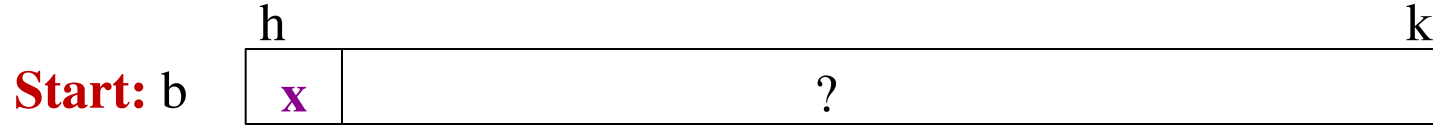
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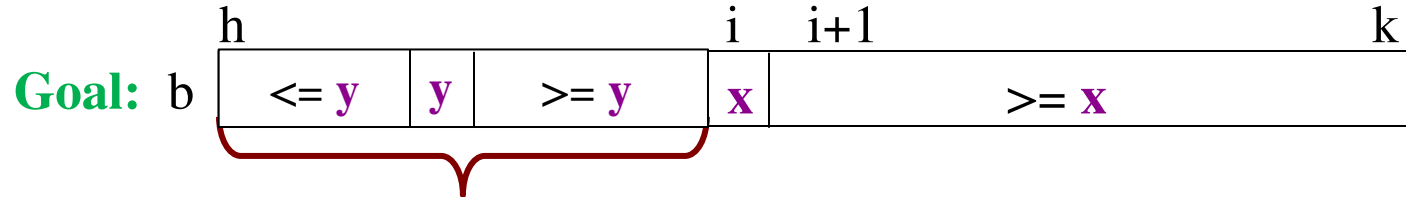
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Sorting with Partitions

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Partition Recursively

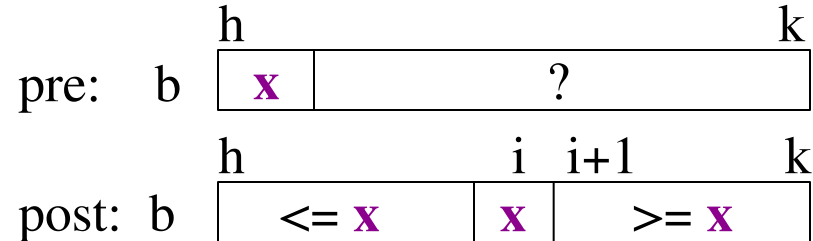
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QuickSort

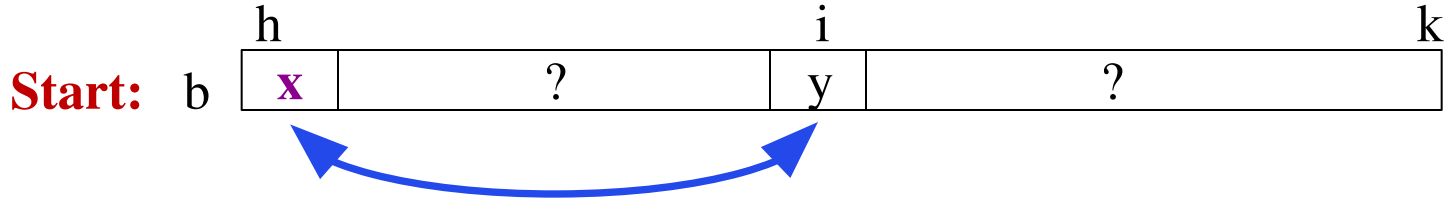
```
def quick_sort(b, h, k):
    """Sort the array fragment b[h..k]"""
    if b[h..k] has fewer than 2 elements:
        return
    j = partition(b, h, k)
    # b[h..j-1] <= b[j] <= b[j+1..k]
    # Sort b[h..j-1] and b[j+1..k]
    quick_sort(b, h, j-1)
    quick_sort(b, j+1, k)
```

- **Worst Case:**
array already sorted
 - Or almost sorted
 - n^2 in that case
- **Average Case:**
array is scrambled
 - $n \log n$ in that case
 - Best sorting time!



So Does that Solve It?

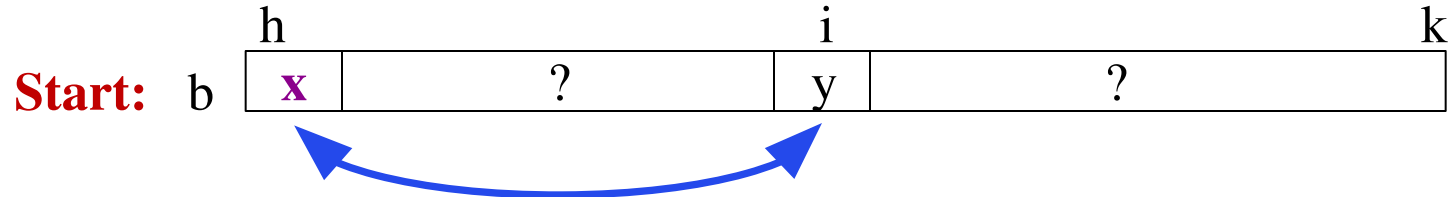
- Worst case still seems bad! Still n^2
 - Only happens in small number of cases
 - Just happens that case is common (already sorted)
- Can greatly reduce issue with randomization
 - Swap start with random element in list
 - Now pivot is random and already sorted unlikely



So Does that Solve It?

- Worst case still seems bad! Still n^2
 - Only happens in small number of cases
 - Just happens
- Can greatly improve
 - Swap state
 - Now pivot is random and already sorted unlikely

Makes it “good enough”
for most applications



Can We Do Better?

- There is guaranteed $n \log n$ sorting algorithm
 - Called **merge sort** (beyond scope of course)
 - Used heavily in large databases
 - But it has high overhead (slower on small data)
- What does the `sort()` method use?
 - Uses **Timsort** (invented by Tim Peters in 2002)
 - Combination of insertion sort and merge sort
 - Insertion on small data, merge sort on large

Can We Do Better?

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Quicksort is 1959!