

# Random Variable & Binomial Distribution

1

## Random Variable

- A random variable is a function from a finite or countably infinite sample space  $S$  to the real numbers. It associates a real number with each possible outcome of an experiment.
- Generally we associate a probability value with each possible outcome of  $X$ . The function describing the distribution is called probability distribution function.
- Example (Binomial Distribution):
  - We are tossing a coin.
  - We score  $x_i=1$  for head and 0 for tail.
  - Each time the probability of head is  $p$ .
  - If we toss  $n$  times, what is the probability the score  $X=x_1+x_2+x_3+\dots+x_n$  will be exactly 2, 3, .. $k$  or  $n$ ?



DESIGN &  
ANALYSIS OF  
ALGORITHM

$$\Pr\{X = k\} \\ = f(n, k, p)$$

LECT-08, S-2  
ALG00F, javed@kent.edu  
Javed I. Khan@1999

## Binomial Distribution

- We are tossing a coin  $n$  times. Each time the probability of head is  $p$ . What is the probability that  $X$ , exactly has the value  $k$ ?
  - the ways of picking  $k$  heads  $\binom{n}{k}$
  - the probability of occurring each  $p^k (1-p)^{n-k}$
  - Binomial probability distribution is written as:

$$\Pr\{X = k\} = b(k; n, p) = \binom{n}{k} p^k (1-p)^{n-k}$$

- The name “binomial” comes from the fact the terms of the expansion of

$$(p+q)^n, \text{ when } p+q=1$$

- A relation:

$$\sum_{k=0}^n b(k; n, p) = \sum_{k=0}^n \binom{n}{k} p^k (1-p)^{n-k} = (p+q)^n = 1$$



DESIGN &  
ANALYSIS OF  
ALGORITHM

LECT-08, S-3  
ALG00F, javed@kent.edu  
Javed I. Khan@1999

## Expectation & Variance of $X$

- Expectation:

$$E[X] = \sum_{k=0}^n kb(k; n, p) = np$$

- Variance:

$$\text{Var}[X] = E[(X - E[X])^2] = npq$$



DESIGN &  
ANALYSIS OF  
ALGORITHM

LECT-08, S-4  
ALG00F, javed@kent.edu  
Javed I. Khan@1999

## Expectation of X (derivation)

- Expectation:

$$\begin{aligned}
 E[X] &= \sum_{k=0}^n kb(k : n, p) \\
 &= \sum_{k=1}^n k \binom{n}{k} p^k \cdot q^{n-k} = \sum_{k=1}^n k \cdot \frac{n!}{k!(n-k)!} p^k \cdot q^{n-k} \\
 &= np \cdot \sum_{k=1}^n \frac{n-1!}{(k-1)!(n-k)!} p^{k-1} \cdot q^{n-k} \\
 &= np \cdot \sum_{k'=0}^{n'} \frac{n'!}{k'!(n'-k')!} p^{k'} \cdot q^{n'-k'} \\
 &= np \sum_{k'=0}^{n'} b(k' : n', p) = np
 \end{aligned}$$



DESIGN &  
ANALYSIS OF  
ALGORITHM

LECT-08, S-5  
ALGO0F, javed@kent.edu  
Javed I. Khan@1999

## Variance of X (derivation)

$$\begin{aligned}
 E[X^2] &= E[(X_1 + X_2 + X_3 + \dots + X_n)^2] \\
 &= \sum_{i=1}^n E[X_i^2] + 2 \binom{n}{2} E[X_i] \cdot E[X_i] \\
 &= np + 2 \frac{n(n-1)}{2} p^2 = np + n^2 p^2 - np^2
 \end{aligned}$$

$$\begin{aligned}
 \text{Var}[X] &= E[(X - E[X])^2] \\
 &= E[X^2] - E[X] \cdot E[X] \\
 &= np + (np)^2 - np^2 - (np)^2 \\
 &= np(1 - p) = npq
 \end{aligned}$$



DESIGN &  
ANALYSIS OF  
ALGORITHM

LECT-08, S-6  
ALGO0F, javed@kent.edu  
Javed I. Khan@1999

# Counting Sort

7

## Idea

- The range of possible keys are known
- all the key are integers in the range 1 to k.
- They can be sorted in  $O(n)$  time!
- Find out the final position of each key.
- Move them there.
- Since, there might be some duplication do some extra tricks..



DESIGN &  
ANALYSIS OF  
ALGORITHM

LECT-08, S-8  
ALG00F, javed@kent.edu  
Javed I. Khan@1999

## Example (range 1-6)

	1	2	3	4	5	6	7	8
A	3	6	4	1	3	4	1	4

	1	2	3	4	5	6	7	8
B							4	
	1	2	3	4	5	6		
C	2	2	4	6	7	8		

	1	2	3	4	5	6		
C	2	0	2	3	0	1		
	1	2	3	4	5	6		
C	2	2	4	7	7	8		

	1	2	3	4	5	6	7	8
B		1						4
	1	2	3	4	5	6		
C	1	2	4	6	7	8		

	1	2	3	4	5	6	7	8
B		1				4	4	
	1	2	3	4	5	6		
C	1	2	4	5	7	8		

	1	2	3	4	5	6	7	8
B	1	1	3	3	4	4	4	6



DESIGN &  
ANALYSIS OF  
ALGORITHM

LECT-08, S-9  
ALGO0F, javed@kent.edu  
Javed I. Khan@1999

## Code

COUNTING-SORT( $A, B, k$ )

```

1  for  $i \leftarrow 1$  to  $k$ 
2    do  $C[i] \leftarrow 0$ 
3  for  $j \leftarrow 1$  to  $\text{length}[A]$ 
4    do  $C[A[j]] \leftarrow C[A[j]] + 1$ 
5  ▷  $C[i]$  now contains the number of elements equal to  $i$ .
6  for  $i \leftarrow 2$  to  $k$ 
7    do  $C[i] \leftarrow C[i] + C[i - 1]$ 
8  ▷  $C[i]$  now contains the number of elements less than or equal to  $i$ .
9  for  $j \leftarrow \text{length}[A]$  downto 1
10   do  $B[C[A[j]]] \leftarrow A[j]$ 
11    $C[A[j]] \leftarrow C[A[j]] - 1$ 

```

*L1-2: Initialization*

*L10-11: Update  
next's position*



DESIGN &  
ANALYSIS OF  
ALGORITHM

LECT-08, S-10  
ALGO0F, javed@kent.edu  
Javed I. Khan@1999

## Complexity



DESIGN &  
ANALYSIS OF  
ALGORITHM

- Analysis:
  - $K$  = possible types of keys
  - $n$  = number of keys
  - L:1-2: Initialization  $O(k)$
  - L:3-4: Counting  $O(n)$
  - L:6-7: Position offset  $O(k)$
  - L:9-11: Moves  $O(n)$
- Overall time complexity  $O(n+k)$
- A Definition: Stability of a Sorting Algorithm
  - Counting sort is stable.
  - Quick sort is not.

COUNTING-SORT( $A, B, k$ )

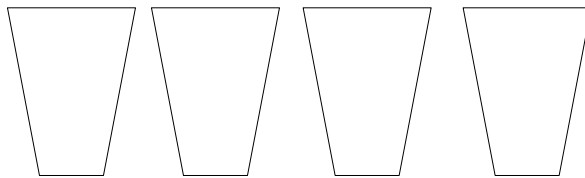
```
1 for  $i \leftarrow 1$  to  $k$ 
2   do  $C[i] \leftarrow 0$ 
3 for  $j \leftarrow 1$  to  $\text{length}[A]$ 
4   do  $C[A[j]] \leftarrow C[A[j]] + 1$ 
5   ▷  $C[i]$  now contains the number
6 for  $i \leftarrow 2$  to  $k$ 
7   do  $C[i] \leftarrow C[i] + C[i - 1]$ 
8   ▷  $C[i]$  now contains the number
9 for  $j \leftarrow \text{length}[A]$  downto 1
10  do  $B[C[A[j]]] \leftarrow A[j]$ 
11      $C[A[j]] \leftarrow C[A[j]] - 1$ 
```

LECT-08, S-11  
ALG00F, javed@kent.edu  
Javed I. Khan@1999

## Radix Sort

## Idea

- Have a number of buckets.
- Sort one alphabet at a time.
- Stack them up.
- Sort next key!



DESIGN &  
ANALYSIS OF  
ALGORITHM

LECT-08, S-13  
ALG00F, javed@kent.edu  
Javed I. Khan@1999

## Example

rat	map	map	car
mop	map	rap	cat
cat	top	car	cot
map	rap	tar	map
car	car	rat	mop
top	tar	cat	rap
cot	rat	mop	rat
tar	cat	top	tar
rap	cot	cot	top

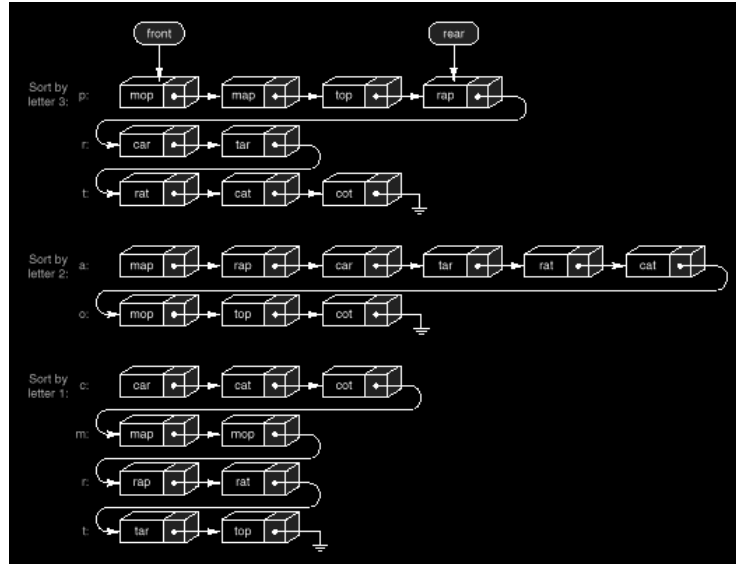
Initial order      Sorted by letter 3      Sorted by letter 2      Sorted by letter 1



DESIGN &  
ANALYSIS OF  
ALGORITHM

LECT-08, S-14  
ALG00F, javed@kent.edu  
Javed I. Khan@1999

## Linked Radix Sort



DESIGN &  
ANALYSIS OF  
ALGORITHM

LECT-08, S-15  
ALG00F, javed@kent.edu  
Javed I. Khan@1999

## The Main Function

```
void RadixSort(List *list)
{
    int    i, j;
    Node   *x;
    Queue  queues[MAXQUEUEARRAY];

    for (i = 0; i < MAXQUEUEARRAY; i++)
        CreateQueue(&queues[i]);
    for (j = KEYSIZE - 2; j >= 0; j--) {
        while(!ListEmpty(list)) {
            DeleteList(0, &x, list);
            AppendNode(x, &queues[QueuePosition(x-
>entry[j])]);
        }
        Rethread(list, queues);
    }
}
```



DESIGN &  
ANALYSIS OF  
ALGORITHM

LECT-08, S-16  
ALG00F, javed@kent.edu  
Javed I. Khan@1999



```

/* QueuePosition: determine the queue position (0 through 27)
   for a character.*/
int QueuePosition(char c)
{
    if (c == ' ')
        return 0;
    else if (isalpha(c))
        return tolower(c) - 'a' + 1;
    else
        return 27;
}

```

```

/* Rethread: rethread a list from an array of
   queues.*/
void Rethread(List *list, Queue queues[])
{
    int i;
    Node *x;
    for (i = 0; i < MAXQUEUEARRAY; i++)
        while(!QueueEmpty(&queues[i])) {
            ServeNode(&x, &queues[i]);
            InsertList(ListSize(list), x, list);
        }
}

```



DESIGN &  
ANALYSIS OF  
ALGORITHM

LECT-08, S-17  
ALG00F, javed@kent.edu  
Javed I. Khan@1999

## Complexity

- N is the number of keys
- k is the max length of the key.
- Time complexity is  $O(nk)$ .
- The best- Merge Sort was  $n \log n!$
- If k is large, but only few key are long Merge sort will be better.
- Is Radix Sort Stable?
  - So long as the single alphabet sort is.



DESIGN &  
ANALYSIS OF  
ALGORITHM

**Any difference  
between a  
comparison in  
quick sort and a  
comparison in  
radix sort?**

LECT-08, S-18  
ALG00F, javed@kent.edu  
Javed I. Khan@1999