

6	9	13	7
12	10	5	
3	1	4	14
15	8	11	2

Mathematics for Computer Science  
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## Random Variables Uniform, Binomial



Albert R Meyer May 6, 2013

binom-uniform.1

6	9	13	7
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## Uniform Random Variables

...all values equally likely

"threshold" variable was uniform:

$$\Pr[Z = 0] = \dots = \Pr[Z = 6] \\ = \frac{1}{7}$$



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binom-uniform.2

6	9	13	7
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## Uniform Distribution

$D$  ::= outcome of fair die roll

$$\Pr[D=1] = \Pr[D=2] = \dots = \Pr[D=6] = 1/6$$

$S$  ::= 4-digit lottery number

$$\Pr[S = 0000] = \Pr[S = 0001] = \dots \\ = \Pr[S = 9999] = 1/10000$$



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binom-uniform.3

6	9	13	7
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## Equal Pairs of Uniform Variables

Lemma. If  $R_1, R_2, R_3$  have the same range, are mutually independent, and  $R_1$  is uniform, then

$$[R_1=R_2], [R_2=R_3], [R_1=R_3]$$

are pairwise independent.

Obviously NOT 3-way indep.



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binom-uniform.4

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## Equal Pairs of Uniform Variables

$R_1$  is independent of  $[R_2 = R_3]$  & has probability  $p$  of equaling each value

So it equals a common value of

$R_2$  &  $R_3$  with probability  $p$

That is,

$$\Pr[R_1=R_2 \mid R_2=R_3] = \Pr[R_1=R_2] = p$$



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binom-uniform.5

6	9	13	7
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## Binomial Random Variable

$B_{n,p} ::= \#$  heads in  $n$  mutually indep flips.

Coin may be biased. So 2 parameters

$n ::= \#$  flips,  $p ::= \Pr\{\text{head}\}$

for  $n=5, p=2/3$

$$\Pr[\text{HHTTH}] =$$

$$\Pr[\text{H}] \cdot \Pr[\text{H}] \cdot \Pr[\text{T}] \cdot \Pr[\text{T}] \cdot \Pr[\text{H}]$$

(by independence)



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binom-uniform.6

6	9	13	7
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## Binomial Random Variable

$B_{n,p} ::= \#$  heads in  $n$  mutually indep flips.

Coin may be biased. So 2 parameters

$n ::= \#$  flips,  $p ::= \Pr\{\text{head}\}$

for  $n=5, p=2/3$

$$\Pr[\text{HHTTH}] =$$

$$\frac{2}{3} \cdot \frac{2}{3} \cdot \frac{1}{3} \cdot \frac{1}{3} \cdot \frac{2}{3}$$



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binom-uniform.7

6	9	13	7
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## Binomial Random Variable

$B_{n,p} ::= \#$  heads in  $n$  mutually indep flips.

Coin may be biased. So 2 parameters

$n ::= \#$  flips,  $p ::= \Pr\{\text{head}\}$

for  $n=5, p=2/3$

$$\Pr[\text{HHTTH}] = \left(\frac{2}{3}\right)^3 \cdot \left(\frac{1}{3}\right)^2$$



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binom-uniform.8

6	9	13	7
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## Binomial Random Variable

$B_{n,p}$  ::= # heads in  $n$  mutually indep flips.

Coin may be biased. So 2 parameters

$n$  ::= # flips,  $p$  ::= Pr{head}

Pr[each sequence w/i H's,  $n-i$  T's] =

$$p^i (1-p)^{n-i}$$



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binom-uniform.9

6	9	13	7
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## Binomial Random Variable

$B_{n,p}$  ::= # heads in  $n$  mutually indep flips.

Coin may be biased. So 2 parameters

$n$  ::= # flips,  $p$  ::= Pr{head}

Pr[get  $i$  H's,  $n-i$  T's] = #seq's · pr[seq]

$$\binom{n}{i} p^i (1-p)^{n-i}$$



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binom-uniform.10

6	9	13	7
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## Binomial Random Variable

$B_{n,p}$  ::= # heads in  $n$  mutually indep flips.

Coin may be biased. So 2 parameters

$n$  ::= # flips,  $p$  ::= Pr{head}

Pr[  $B_{n,p} = i$  ] = #seq's · pr{seq}

$$\binom{n}{i} p^i (1-p)^{n-i}$$



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binom-uniform.11

6	9	13	7
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## Density & Distribution

Probability Density Function  
of random variable  $R$ ,

$$\text{PDF}_R(a) ::= \Pr[R = a]$$

SO 
$$\text{PDF}_{B_{n,p}}(i) = \binom{n}{i} p^i (1-p)^{n-i}$$



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binom-uniform.12

6	9	13	7
12		10	5
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## Density & Distribution

Probability Density Function  
of random variable  $R$ ,

$$\text{PDF}_R(a) ::= \Pr[R = a]$$

so

$$\text{PDF}_U(v) = \text{constant}$$

for  $v$  in range of uniform  $U$



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binom-uniform.13

6	9	13	7
12		10	5
3	1	4	14
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## Density & Distribution

Probability Density Function  
of random variable  $R$ ,

$$\text{PDF}_R(a) ::= \Pr[R = a]$$

Cumulative Distribution

$$\text{CDF}_R(a) ::= \Pr[R \leq a]$$



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binom-uniform.14

6	9	13	7
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## Density & Distribution

Key observation:

The Probability Density &  
Cumulative Distribution  
Functions of  $R$ , do not  
depend on the sample space



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binom-uniform.15