

## **Simulation Basics**

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#### Important simulation functions

#### **Distributions**

rbeta, rbinom, rcauchy, rchisq, rexp, rf, rgamma, rgeom, rhyper, rlogis, rlnorm, rnbinom, rnorm,
 rpois, rt, runif, rweibull

#### **Densities**

 dbeta,dbinom, dcauchy, dchisq, dexp, df, dgamma, dgeom, dhyper, dlogis, dlnorm, dnbinom, dnorm, dpois, dt, dunif, dweibull

#### Sampling

sample(,replace=TRUE),sample(replace=FALSE)

### rfoo functions generate data

#### **Normal**

```
args(rnorm)

function (n, mean = 0, sd = 1)

NULL

heights = rnorm(10, mean=188, sd=3)
heights

[1] 192.2 192.0 187.5 188.0 189.2 190.1 187.4 185.1 187.4 187.7
```

### rfoo functions generate data

#### **Binomial**

```
args(rbinom)

function (n, size, prob)

NULL

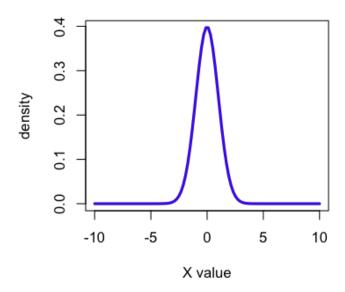
coinFlips = rbinom(10, size=10, prob=0.5)
coinFlips

[1] 6 4 6 7 5 6 6 3 3 7
```

### **Example distribution: Normal**

Normal Distribution:  $N(\mu, \sigma)$ 

•  $X \sim N(0, 1)$ 



### dfoo functions calculate the density

#### **Normal**

```
args(dnorm)

function (x, mean = 0, sd = 1, log = FALSE)

NULL

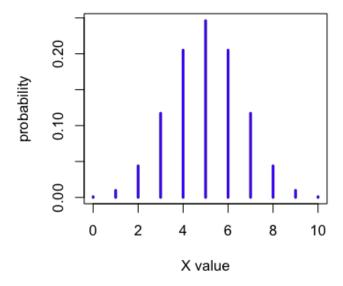
x = seq(from=-5,to=5,length=10)
normalDensity = dnorm(x,mean=0,sd=1)
round(normalDensity,2)

[1] 0.00 0.00 0.01 0.10 0.34 0.34 0.10 0.01 0.00 0.00
```

### **Example distribution: Binomial**

**Binomial distribution:** Bin(n, p)

•  $X \sim Bin(10, 0.5)$ 



### dfoo functions calculate the density

#### **Binomial**

```
args(dbinom)

function (x, size, prob, log = FALSE)

NULL

x = seq(0,10,by=1)
binomialDensity = dbinom(x,size=10,prob=0.5)
round(binomialDensity,2)

[1] 0.00 0.01 0.04 0.12 0.21 0.25 0.21 0.12 0.04 0.01 0.00
```

### Sample draws a random sample

```
args(sample)
function (x, size, replace = FALSE, prob = NULL)
NULL
heights = rnorm(10, mean=188, sd=3)
heights
 [1] 190.5 187.8 184.4 187.0 189.5 189.5 183.6 192.5 188.6 188.1
sample(heights, size=10, replace=TRUE)
 [1] 187.8 188.1 183.6 187.8 187.0 188.6 184.4 187.8 190.5 190.5
```

### Sample draws a random sample

heights

```
[1] 190.5 187.8 184.4 187.0 189.5 189.5 183.6 192.5 188.6 188.1
```

sample(heights, size=10, replace=FALSE)

[1] 189.5 189.5 188.1 183.6 187.8 187.0 184.4 188.6 192.5 190.5

# Sample can draw according to a set of probabilities

```
heights
 [1] 190.5 187.8 184.4 187.0 189.5 189.5 183.6 192.5 188.6 188.1
probs = c(0.4, 0.3, 0.2, 0.1, 0, 0, 0, 0, 0, 0)
sum(probs)
[1] 1
sample(heights, size=10, replace=TRUE, prob=probs)
 [1] 184.4 187.0 187.8 190.5 187.0 190.5 190.5 190.5 187.0 190.5
```

### Setting a seed

Setting a seed ensures reproducible results from random processes in R

```
set.seed(12345)
rnorm(5,mean=0,sd=1)

[1] 0.5855 0.7095 -0.1093 -0.4535 0.6059

set.seed(12345)
rnorm(5,mean=0,sd=1)

[1] 0.5855 0.7095 -0.1093 -0.4535 0.6059
```

#### For more information

More on distributions in R

http://cran.r-project.org/web/views/Distributions.html

**Computing for Data Analysis** 

Simulation in R