

```

1   Course: Statistical_Inference
2   Lesson: CommonDistros
3
4   - Class: text
5   Output: "Common Distributions. (Slides for this and other Data Science courses may be
6   found at github https://github.com/DataScienceSpecialization/courses/. If you care to
7   use them, they must be downloaded as a zip file and viewed locally. This lesson
8   corresponds to 06_Statistical_Inference/06_CommonDistros.)"
9
10  - Class: mult_question
11  Output: Given the title of this lesson, what do you think it will cover?
12  AnswerChoices: Common Distributions; Rare Distributions; Common Bistros; I haven't a
13  clue
14  CorrectAnswer: Common Distributions
15  AnswerTests: omnitest(correctVal='Common Distributions')
16  Hint: Part of the title is an abbreviation for another word we've seen several times
17  in earlier lessons.
18
19  - Class: text
20  Output: The first distribution we'll examine is the Bernoulli which is associated
21  with experiments which have only 2 possible outcomes. These are also called (by
22  people in the know) binary trials.
23
24  - Class: mult_question
25  Output: It might surprise you to learn that you've probably had experience with
26  Bernoulli trials. Which of the following would be a Bernoulli trial?
27  AnswerChoices: Drawing a card from a deck; Tossing a die; Flipping a coin; Spinning a
28  roulette wheel
29  CorrectAnswer: Flipping a coin
30  AnswerTests: omnitest(correctVal='Flipping a coin')
31  Hint: Which of the choices has only two possible outcomes?
32
33  - Class: mult_question
34  Output: For simplicity, we usually say that Bernoulli random variables take only the
35  values 1 and 0. Suppose we also specify that the probability that the Bernoulli
36  outcome of 1 is p. Which of the following represents the probability of a 0 outcome?
37  AnswerChoices: p; 1-p; p^2; p(1-p)
38  CorrectAnswer: 1-p
39  AnswerTests: omnitest(correctVal='1-p')
40  Hint: Recall that the sum of the probabilities of all the outcomes is 1.
41
42  - Class: mult_question
43  Output: If the probability of a 1 is p and the probability of a 0 is 1-p which of the
44  following represents the PMF of a Bernoulli distribution? Recall that the PMF is the
45  function representing the probability that  $X=x$ .
46  AnswerChoices:  $p^x * (1-p)^{(1-x)}$ ;  $p^{(1-x)} * (1-p)^{(1-x)}$ ;  $p*(1-p)$ ;  $x*(1-x)$ 
47  CorrectAnswer:  $p^x * (1-p)^{(1-x)}$ 
48  AnswerTests: omnitest(correctVal='p^x * (1-p)^(1-x)')
49  Hint: When  $x=1$ , which of the given expressions yields p?
50
51  - Class: mult_question
52  Output: Recall the definition of the expectation of a random variable. Suppose we
53  have a Bernoulli random variable and, as before, the probability it equals 1 (a
54  success) is p and probability it equals 0 (a failure) is 1-p. What is its mean?
55  AnswerChoices: p; 1-p; p^2; p(1-p)
56  CorrectAnswer: p
57  AnswerTests: omnitest(correctVal='p')
58  Hint: Add the two terms  $x*p(x)$  where x equals 0 and 1 respectively.
59
60  - Class: mult_question
61  Output: Given the same Bernoulli random variable above, which of the following
62  represents  $E(X^2)$ 
63  AnswerChoices:  $p(1-p)$ ;  $p^2$ ;  $(1-p)^2$ ; p; 1-p
64  CorrectAnswer: p
65  AnswerTests: omnitest(correctVal='p')
66  Hint: Add the two terms  $x^2*p(x)$  where x equals 0 and 1 respectively.
67
68  - Class: mult_question
69  Output: Use the answers of the last two questions to find the variance of the

```

```

Bernoulli random variable. Recall  $\text{Var} = E(X^2) - (E(X))^2$ 
54 AnswerChoices: p(1-p); p^2-p; p(p-1); p^2*(1-p)^2
55 CorrectAnswer: p(1-p)
56 AnswerTests: omnitest(correctVal='p(1-p)')
57 Hint:  $E(X^2)=p$  and  $E(X)=p$ , so  $\text{Var}=p-p^2$ . Rewrite this expression by factoring out the
    p.
58
59 - Class: text
60 Output: Binomial random variables are obtained as the sum of iid Bernoulli trials.
    Specifically, let  $X_1, \dots, X_n$  be iid Bernoulli(p) random variables; then  $X = X_1 + X_2 + \dots + X_n$ 
    is a binomial random variable. Binomial random variables represent the
    number of successes, k, out of n independent Bernoulli trials. Each of the trials has
    probability p.
61
62 - Class: mult_question
63 Output: The PMF of a binomial random variable X is the function representing the
    probability that  $X=x$ . In other words, that there are x successes out of n independent
    trials. Which of the following represents the PMF of a binomial distribution? Here x,
    the number of successes, goes from 0 to n, the number of trials, and  $\text{choose}(n,x)$ 
    represents the binomial coefficient ' $n$  choose  $x$ ' which is the number of ways x
    successes out of n trials can occur regardless of order.
64 AnswerChoices:  $\text{choose}(n,x) * p^x * (1-p)^{(n-x)}$ ;  $\text{choose}(n,x) * p^{(n-x)} * (1-p)^x$ ;  $p^x$ ;
     $\text{choose}(n,x) * p^x * (1-p)^{(1-x)}$ 
65 CorrectAnswer:  $\text{choose}(n,x) * p^x * (1-p)^{(n-x)}$ 
66 AnswerTests: omnitest(correctVal='choose(n,x) * p^x * (1-p)^{(n-x)}')
67 Hint: To take the value x, the random variable X must have x 'successes'. Each of
    these occurs with probability p. It also must have n-x 'failures', each of which
    occurs with probability (1-p). We don't care about the order in which the successes
    and failures occur so we have to multiply by  $\text{choose}(n,x)$ .
68
69 - Class: cmd_question
70 Output: Suppose we were going to flip a biased coin 5 times. The probability of
    tossing a head is .8 and a tail .2. What is the probability that you'll toss at least
    3 heads.
71 CorrectAnswer: 0.94208
72 AnswerTests: equiv_val(0.94208)
73 Hint: You'll have to add together 3 terms each of the form,
     $\text{choose}(5,x) * (.8)^x * (.2)^{(5-x)}$  for  $x=3,4,5$  .
74
75 - Class: cmd_question
76 Output: Now you can verify your answer with the R function pbinom. The quantile is 2,
    the size is 5, the prob is .8 and the lower.tail is FALSE. Try it now.
77 CorrectAnswer: pbinom(2,size=5,prob=.8,lower.tail=FALSE)
78 AnswerTests: omnitest(correctExpr='pbinom(2,size=5,prob=.8,lower.tail=FALSE)')
79 Hint: Type pbinom(2,size=5,prob=.8,lower.tail=FALSE) at the R prompt.
80
81 - Class: text
82 Output: Another very common distribution is the normal or Gaussian. It has a
    complicated density function involving its mean mu and variance  $\sigma^2$ . The key fact
    of the density formula is that when plotted, it forms a bell shaped curve, symmetric
    about its mean mu. The variance  $\sigma^2$  corresponds to the width of the bell, the
    higher the variance, the fatter the bell. We denote a normally distributed random
    variable X as  $X \sim N(\mu, \sigma^2)$ .
83
84 - Class: text
85 Output: When  $\mu = 0$  and  $\sigma = 1$  the resulting distribution is called the standard
    normal distribution and it is often labeled Z.
86
87 - Class: figure
88 Output: Here's a picture of the density function of a standard normal distribution.
    It's centered at its mean 0 and the vertical lines (at the integer points of the
    x-axis) indicate the standard deviations.
89 Figure: plotNormal.R
90 FigureType: new
91
92 - Class: figure
93 Output: Approximately 68%, 95% and 99% of the normal density lie within 1, 2 and 3
    standard deviations from the mean, respectively. These are shown in the three shaded
    areas of the figure. For example, the darkest portion (between -1 and 1) represents

```

```

68% of the area.
94 Figure: stddev1.R
95 FigureType: new
96
97 - Class: cmd_question
98 Output: The R function qnorm(prob) returns the value of x (quantile) for which the
area under the standard normal distribution to the left of x equals the parameter
prob. (Recall that the entire area under the curve is 1.) Use qnorm now to find the
10th percentile of the standard normal. Remember the argument prob must be between 0
and 1. You don't have to specify any of the other parameters since the default is the
standard normal.
99 CorrectAnswer: qnorm(.10)
100 AnswerTests: omnitest(correctExpr='qnorm(.10)')
101 Hint: Type qnorm(.1) at the R prompt.
102
103 - Class: figure
104 Output: We'll see this now by drawing the vertical line at the quantile -1.281552.
105 Figure: plotQuantile.R
106 FigureType: new
107
108 - Class: mult_question
109 Output: Which of the following would you expect to be the 1st percentile?
110 AnswerChoices: -2.33; -1.0; 0; 2.33; -1.28
111 CorrectAnswer: -2.33
112 AnswerTests: omnitest(correctVal='-2.33')
113 Hint: Since 1 is smaller than 10 the quantile for the 1st percentile should be
smaller than the quantile for 10th percentile.
114
115 - Class: cmd_question
116 Output: By looking at the picture can you say what the 50th percentile is?
117 CorrectAnswer: 0
118 AnswerTests: equiv_val(0)
119 Hint: What point x marks the halfway point of the graph?
120
121 - Class: mult_question
122 Output: We can use the symmetry of the bell curve to determine other quantiles. Given
that 2.5% of the area under the curve falls to the left of  $x = -1.96$ , what is the 97.5
percentile for the standard normal?
123 AnswerChoices: 1.96; 2.33; -1.28; 2
124 CorrectAnswer: 1.96
125 AnswerTests: omnitest(correctVal='1.96')
126 Hint: 2.5% of the area falls to the right of the quantile of the 97.5 percentile.
127
128 - Class: text
129 Output: Here are two useful facts concerning normal distributions. If X is a normal
random variable with mean  $\mu$  and variance  $\sigma^2$ , i.e.,  $X \sim N(\mu, \sigma^2)$ ,
130
131 - Class: text
132 Output: then the random variable Z defined as  $Z = (X - \mu) / \sigma$  is normally
distributed with mean 0 and variance 1, i.e.,  $Z \sim N(0, 1)$ . (Z is standard normal.)
133
134 - Class: text
135 Output: The converse is also true. If Z is standard normal, i.e.,  $Z \sim N(0, 1)$ , then
the random variable X defined as  $X = \mu + \sigma * Z$  is normally distributed with mean
 $\mu$  and variance  $\sigma^2$ , i.e.,  $X \sim N(\mu, \sigma^2)$ 
136
137 - Class: text
138 Output: These formulae allow you to easily compute quantiles (and thus percentiles)
for ANY normally distributed variable if you know its mean and variance. We'll show
how to find the 97.5th percentile of a normal distribution with mean 3 and variance 4.
139
140 - Class: cmd_question
141 Output: Again, we can use R's qnorm function and simply specify the mean and standard
deviation (the square root of the variance). Do this now. Find the 97.5th percentile
of a normal distribution with mean 3 and standard deviation 2.
142 CorrectAnswer: qnorm(.975, mean=3, sd=2)
143 AnswerTests: omnitest(correctExpr='qnorm(.975, mean=3, sd=2)')
144 Hint: Type qnorm(.975, mean=3, sd=2) at the R prompt.
145

```

```

146 - Class: cmd_question
147 Output: Let's check it using the formula above,  $X = \mu + \sigma \cdot Z$ . Here we'll use the
148 97.5th percentile for the standard normal as the value Z in the formula. Recall that
149 we previously calculated this to be 1.96. Let's multiply this by the standard
150 deviation of the given normal distribution (2) and add in its mean (3) to see if we
151 get a result close to the one qnorm gave us.
152 CorrectAnswer: 6.92
153 AnswerTests: equiv_val(6.92)
154 Hint: Type  $1.96 \cdot 2 + 3$  at the R prompt.
155
156 - Class: cmd_question
157 Output: Suppose you have a normal distribution with mean 1020 and standard deviation
158 of 50 and you want to compute the probability that the associated random variable  $X >$ 
159 1200. The easiest way to do this is to use R's pnorm function in which you specify
the quantile (1200), the mean (1020) and standard deviation (50). You also must
specify that the lower.tail is FALSE since we're asking for a probability that the
random variable is greater than our quantile. Do this now.
154 CorrectAnswer: pnorm(1200,mean=1020,sd=50,lower.tail=FALSE)
155 AnswerTests: omnitest(correctExpr='pnorm(1200,mean=1020,sd=50,lower.tail=FALSE)')
156 Hint: Type pnorm(1200,mean=1020,sd=50,lower.tail=FALSE) at the R prompt.
157
158 - Class: cmd_question
159 Output: Alternatively, we could use the formula above to transform the given
distribution to a standard normal. We compute the number of standard deviations the
specified number (1200) is from the mean with  $Z = (X - \mu) / \sigma$ . This is our new
quantile. We can then use the standard normal distribution and the default values of
pnorm. Remember to specify that lower.tail is FALSE. Do this now.
160 CorrectAnswer: pnorm((1200-1020)/50,lower.tail=FALSE)
161 AnswerTests: omnitest(correctExpr='pnorm((1200-1020)/50,lower.tail=FALSE)')
162 Hint: Type pnorm((1200-1020)/50,lower.tail=FALSE) at the R prompt.
163
164 - Class: cmd_question
165 Output: For practice, using the same distribution, find the 75% percentile. Use
qnorm and specify the probability (.75), the mean (1020) and standard deviation (50).
Since we want to include the left part of the curve we can use the default
lower.tail=TRUE.
166 CorrectAnswer: qnorm(.75,mean=1020,sd=50)
167 AnswerTests: omnitest(correctExpr='qnorm(.75,mean=1020,sd=50)')
168 Hint: Type qnorm(.75,mean=1020,sd=50) at the R prompt.
169
170 - Class: cmd_question
171 Output: Note that R functions pnorm and qnorm are inverses. What would you expect
pnorm(qnorm(.53)) to return?
172 CorrectAnswer: .53
173 AnswerTests: equiv_val(.53)
174 Hint: Type pnorm(qnorm(.53)) at the R prompt.
175
176 - Class: cmd_question
177 Output: How about qnorm(pnorm(.53))?
178 CorrectAnswer: .53
179 AnswerTests: equiv_val(.53)
180 Hint: Type qnorm(pnorm(.53)) at the R prompt.
181
182 - Class: text
183 Output: Now let's talk about our last common distribution, the Poisson. This is, as
Wikipedia tells us, "a discrete probability distribution that expresses the
probability of a given number of events occurring in a fixed interval of time and/or
space if these events occur with a known average rate and independently of the time
since the last event."
184
185 - Class: text
186 Output: In other words, the Poisson distribution models counts or number of event in
some interval of time. From Wikipedia, "Any variable that is Poisson distributed only
takes on integer values."
187
188 - Class: text
189 Output: The PMF of the Poisson distribution has one parameter, lambda. As with the
other distributions the PMF calculates the probability that the Poisson distributed
random variable X takes the value x. Specifically,  $P(X=x) = (\lambda^x / x!) e^{-\lambda}$ .

```

Here  $x$  ranges from 0 to infinity.

```
190
191 - Class: text
192 Output: The mean and variance of the Poisson distribution are both lambda.
193
194 - Class: text
195 Output: Poisson random variables are used to model rates such as the rate of hard
drive failures. We write  $X \sim \text{Poisson}(\lambda * t)$  where  $\lambda$  is the expected count per
unit of time and  $t$  is the total monitoring time.

196
197 - Class: cmd_question
198 Output: For example, suppose the number of people that show up at a bus stop is
Poisson with a mean of 2.5 per hour, and we want to know the probability that at most
3 people show up in a 4 hour period. We use the R function ppois which returns a
probability that the random variable is less than or equal to 3. We only need to
specify the quantile (3) and the mean ( $2.5 * 4$ ). We can use the default parameters,
lower.tail=TRUE and log.p=FALSE. Try it now.
199 CorrectAnswer: ppois(3,2.5 * 4)
200 AnswerTests: ANY_of_exprs('ppois(3,2.5 * 4)', 'ppois(3,4*2.5)')
201 Hint: Type ppois(3,2.5 * 4) at the R prompt.
202
203 - Class: text
204 Output: Finally, the Poisson distribution approximates the binomial distribution in
certain cases. Recall that the binomial distribution is the discrete distribution of
the number of successes,  $k$ , out of  $n$  independent binary trials, each with probability
 $p$ . If  $n$  is large and  $p$  is small then the Poisson distribution with  $\lambda$  equal to
 $n * p$  is a good approximation to the binomial distribution.

205
206 - Class: cmd_question
207 Output: To see this, use the R function pbinom to estimate the probability that
you'll see at most 5 successes out of 1000 trials each of which has probability .01.
As before, you can use the default parameter values (lower.tail=TRUE and log.p=FALSE)
and just specify the quantile, size, and probability.
208 CorrectAnswer: pbinom(5,1000,.01)
209 AnswerTests: omnitest(correctExpr='pbinom(5,1000,.01)')
210 Hint: Type pbinom(5,1000,.01) at the R prompt.
211
212 - Class: cmd_question
213 Output: Now use the function ppois with quantile equal to 5 and  $\lambda$  equal to  $n * p$ 
to see if you get a similar result.
214 CorrectAnswer: ppois(5,1000*.01)
215 AnswerTests: omnitest(correctExpr='ppois(5,1000*.01)')
216 Hint: Type ppois(5,1000*.01) at the R prompt.
217
218 - Class: text
219 Output: See how they're close? Pretty cool, right? This worked because  $n$  was large
(1000) and  $p$  was small (.01).

220
221 - Class: text
222 Output: Congrats! You've concluded this uncommon lesson on common distributions.
223
224 - Class: mult_question
225 Output: "Would you like to receive credit for completing this course on
226 Coursera.org?"
227 CorrectAnswer: NULL
228 AnswerChoices: Yes;No
229 AnswerTests: coursera_on_demand()
230 Hint: ""
231
```