

# Miscellaneous discrete random variable examples

Math 30530, Fall 2013

September 27, 2013

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**Negative binomial random variable:** Parameters  $m$  and  $p$

- Counts number of independent trials (each with success probability  $p$ ) until exactly  $m$  successes have been recorded
- Possible values:  $k = m, m + 1, m + 2, \dots$
- Mass function:  $\Pr(X = k) = \binom{k-1}{m-1} p^m (1 - p)^{k-m}$

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When  $m = 1$ , Negative binomial becomes geometric

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Sampling *without* replacement, so can't use binomial. Instead count number of successful outcomes, divided by total number of outcomes.

$$p = \frac{\binom{7}{4} \binom{13}{4}}{\binom{20}{8}} \approx .1986$$

(compare  $\Pr(\text{Binomial}(8, .35) = 4) \approx .1875$ )

## Hypergeometric, continued

**Hypergeometric random variable:** Parameters  $N$ ,  $M$  and  $r$

- Sample, without replacement,  $r$  things from a set that has  $N$  “good” things and  $M$  “bad” things, and count the number of “good” things in the sample
- Possible values:  $k = 0, 1, \dots, r$
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When  $N, M$  large, negative binomial very close to binomial with  $p = r/M$

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**A:** Possible values  $n, \dots, 2n - 1$ .

$$\begin{aligned}\Pr(X = k) &= \binom{k-1}{n-1} p^n (1-p)^{k-n} + \binom{k-1}{n-1} (1-p)^n (1-p)^{k-n} \\ &= (\text{Red Sox win}) + (\text{Rays win})\end{aligned}$$

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**A:**  $\sum_{k=n}^{2n-1} \binom{k-1}{n-1} p^n (1-p)^{k-n}$

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$$p \text{ versus } p^2 + 2p^2(1 - p) = 3p^2 - 2p^3$$

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General pattern: the longer series is better for the stronger team; see homework solutions for a complete verification

## Banach's matchbox problem

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See [http:](http://www-stat.stanford.edu/~susan/surprise/Banach.html)

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