SOA and CAS: Exam P, Probability¹ Chapter 18 and 19: Binomial and Negative Binominal Distributions

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Chapter 18: Binomial Distribution: Single Variable Chapter 19: Negative Binominal Distribution: Single Variable

(1) Chapter 18: Binomial Distribution: Discrete Single Variable

(1.1) Binomial Distribution

Definition: P(N = k) stands for the probability of "number of successful trails = k"

Example (1.1.a): An urn contains red and blue balls. P(red) = p and P(blue) = 1 - p. Now, draw a ball from this urn, observe the color, put it back (*draw with repalcement*). Then, draw another ball, observe the color, put it back. Repeat this process n times. Then, P(N = k) stands for P(out of n draws, the "number of red" = k). Note that we actually have n Bernoulli trails. Each trail has two outcomes: red ball or blue ball with P(red) = p and P(blue) = 1 - p.

Formula:

$$Pr(N = k) = C_n^k * p^k * (1 - p)^{n-k}$$
(1)

where n: number of Bernoulli trails. Each Bernoulli trail has two outcomes, such as: success or fail, red or blue. P(success/red) = p and P(fail/blue) = 1 - p

Example (1.1.b): 1000 machines, 15 are defective. Draw 20 times repeatedly. Question: What is $P(k \le 2)$?

Solve:
$$P(k \le 2) = (\underbrace{k=0}_{\#defective \ is \ 0}) + (\underbrace{k=1}_{\#defective \ is \ 1}) + (\underbrace{k=2}_{\#defective \ is \ 2})$$

$$= C_{20}^{0} * p^{0} * (1-p)^{20-0} + C_{20}^{1} * p^{1} * (1-p)^{20-1} + C_{20}^{2} * p^{2} * (1-p)^{20-2}$$
$$where \ p = \frac{15}{1000}$$

(1.2) Hypergeometric Distribution

Definition: P(N = k) stands for the probability of "number of successful trails = k". Recall that the process in the binomial distribution is "draw with replacement". Here, the process is "draw without replacement".

Example (1.2.a): A set contains N samples, D defective. Now, draw one, draw another one, draw the third one (draw without replacement)..., draw n times in total.

Question: What is P(d defective in n samples)?

Solve:
$$P(d \ defective) = \frac{A}{B} = \frac{C_D^d C_{N-D}^{n-d}}{C_N^n} = \frac{\text{``draw d from D defective'' * ``rest (n-d) $draw $from the rest (N-D)''}}{\text{``draw n from $N'''}}$$

Example (1.2.b): 1000 machines, 15 are defective. Draw 20 times without repalcement. Question: What is $P(k \le 2)$?

By definition: we know the process is Hypergeometric(n, p).

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Solve:
$$P(k \le 2) = (\underbrace{k=0}_{\#defective \ is \ 0}) + (\underbrace{k=1}_{\#defective \ is \ 1}) + (\underbrace{k=2}_{\#defective \ is \ 2})$$

$$= \frac{C_{15}^0 * C_{1000}^{20-0}}{C_{1000}^2} + \frac{C_{15}^1 * C_{1000-15}^{20-1}}{C_{1000}^{20}} + \frac{C_{15}^2 * C_{1000-15}^{20-2}}{C_{1000}^{20}}$$

(1.3) Trinominal Distribution

For example: one urn contains three different classes of balls. First class has a same balls. Second class has balls. Third class has c same balls. P(draw one a)=0.6, P(draw one b)=0.3, P(draw one c)=0.1. Then, $P(draw 3 \text{ first class}, 2 \text{ second class}, 1 \text{ third class})=\frac{6!}{3!2!1!}(0.6)^3(0.2)^2(0.1)^1$

(1.4) Summary

	Bernoulli	Binomial	Hypergeometric
Mean	р	np	$\frac{nD}{N}$
Variance	1-p	np * (1-p)	$\frac{nD}{N} * \frac{N-D}{N} * \frac{N-n}{N-1}$

(2) Chapter 19: Negative Binominal Distribution: Single Variable

(2.1) Negative Binominal Distribution

Definition: (i) a total of (n+k) trails, the very last trail is "a successful trail". In the previous (n+k-1) trails, there are n unsuccessful trails; (ii) Each trail can only have 2 outcomes: successful trail or unsuccessful trail. P(successful)=p and P(unsuccessful)=1 - p

$$P(N = k) = \underbrace{C_{n+k-1}^{n}(1-p)^{n}(p)^{k-1}}_{n+(k-1) \text{ has } n \text{ unsuccessful trails, } k-1 \text{ successful trails}}^{*}_{\text{last one is a successful trail}}$$

Example (2.1.a): Give P(win)=0.6Question: $P(4^{th} \text{ game win, occurs before, } 3^{rd} \text{ lose})$?

Solve: we know that the last trail (in the total 7 trails) must be a lose trail. Then, in order to have the 4^{th} win before the 3^{rd} lose, the previous (4+2) trails should have at least 4 wins.

$$Probability = P(N = 4) + P(N = 5) + P(N = 6)$$

where $P(N = 4) = C_6^4(p)^4(1 - p)^2$
 $P(N = 5) = C_6^5(p)^5(1 - p)^1$
 $P(N = 6) = C_6^6(p)^6(1 - p)^0$
 $p = 0.6$

Example (2.1.b): Give P(win)=0.6

Question: $P(6^{th} \text{ game is win, which is also the } 4^{th} \text{ win})$?

Solve: we know that the last trail (in the total 6 trails) must be a win trail. Then, in order to make the 4^{th} win happens at the 6th trail, the previous 5 trails should have 3 wins and 2 loses.

$$\begin{aligned} Probability &= P(N=2) = P(2 \ loses) \\ &= \underbrace{C_5^2(1-p)^2(p)^3}_{total \ 5 \ trails, \ 2 \ unsuccessful \ and \ 3 \ successful \ last \ one \ is \ a \ successful \ trail} \\ \end{aligned}$$

where
$$p = 0.6$$

(2.2) Geometric Distribution

Definition: (i) a total of (n+1) trails, the very last trail is "a successful trail". The previous n trails are all unsuccessful trails; (ii) Each trail can only have 2 outcomes: successful and unsuccessful. P(successful)=p and P(unsuccessful)=1-p

$$P(N = k) = \underbrace{(1-p)^n}_{n \text{ trails are all unsuccessful trails}} * p_{\text{last one is the only successful trails}}$$
$$= (1-p)^n p$$

where n=0, 1, 2,...

		Geometric Distribution
	Negative Binominal	Special case: (k=1: last trail is the only success trail)
Mean	$\frac{k}{p}(1-p)$	$rac{1}{p}(1-p)$
Variance	$\frac{k}{p^2}(1-p)$	$rac{1}{p^2}(1-p)$
Formula	$P(X = n) = C_{n+k-1}^{n} (1-p)^{n} p^{k}$	$P(X = n) = (1 - p)^n p^1$

Example (2.2): With replacement: A shipment contains 20 packages, 7 are damaged. Randomly draw without replacement until the 4^{th} damaged package is discovered.

Question: What is the P(exactly 12 packages are inspected)?

Solve: we know that the 12th package must be a damaged one. Thus, the previous 11 packages must contains 3 damage packages. (i) the previous 11 inspected packages: 3 damaged packages should be drawn from the total 7 damaged packages, while 8 packages should be drawn from the total 13 undamaged packages. That is $\frac{A}{B} = \frac{C_7^3 C_{13}^8}{C_{20}^{11}} = 0.26$; (ii) the last 12th damaged package should be drawn from the total 4 remaining damaged packages. That is $\frac{C}{D} = \frac{C_4^1}{C_9^1} = \frac{4}{9}$. Overall, P(exactly 12 packages are inspected)= $\frac{A}{B} * \frac{C}{D} = 0.26 * \frac{4}{9} = 0.12$