

# Geometric Distribution Examples



|                  |                 |                       |
|------------------|-----------------|-----------------------|
| FREE PARKING     | NEW YORK AVENUE | 2000                  |
| TENNESSEE AVENUE | 1800            | COMMUNITY CHEST       |
| ST. JAMES PLACE  | 1800            | PENNSYLVANIA RAILROAD |
| VIRGINIA AVENUE  | 1600            | STATES AVENUE         |
| ELECTRIC COMPANY | 1500            | ST. CHARLES PLACE     |

**COLLECT & WIN!**

**DELTA VACATIONS**

**WIN a Dream Trip**  
to 1 of 250+ Destinations (20 available)<sup>1</sup>  
Collect All 3 Stamps  
Stamps: 512, 513 & 514

**COLLECT & WIN!**

**Beaches**

**Make Your Getaway**  
Beaches® Resorts Luxury Included®  
Caribbean Vacation (75 available)<sup>2</sup>  
Collect All 3 Stamps  
Stamps: 515, 516 & 517

**COLLECT & WIN!**

**Cessna**

**Cessna Private Jet Trip**  
(2 available)<sup>3</sup>  
Collect All 3 Stamps  
Stamps: 518, 519 & 520

**COLLECT & WIN!**

**Mobile Wallet**  
from  
Verizon

**\$2,500**  
and a smartphone with  
Mobile Wallet (238 available)<sup>4</sup>  
Collect All 3 Stamps  
Stamps: 509, 510 & 511

**COLLECT & WIN!**

**\$10,000**  
Cash Prize to Help Get Your Bills Paid  
(4 available)<sup>5</sup>  
Collect Both Stamps  
Stamps: 527 & 528

**COLLECT & WIN!**

**Target**

**\$5,000**  
Target Shopping Experience with  
Early Access on Black Friday (10 available)<sup>6</sup>  
Collect All 4 Stamps  
Stamps: 523, 524, 525 & 526

**COLLECT & WIN!**

**\$5,000**  
Cash Prize (5 available)<sup>7</sup>  
Collect All 3 Stamps

**COLLECT & WIN!**

**Shell**

**Fuel for a Year**  
(4 available)<sup>8</sup>  
Collect All 3 Stamps

**COLLECT & WIN!**

**\$50**  
Cash Prize (1,000 available)<sup>9</sup>  
Collect Both Stamps

**COLLECT & WIN!**

**\$1,000,000**  
Payable \$50,000/yr for 20 yrs, no interest  
(1 available)<sup>10</sup> Collect Both Stamps

|                       |            |
|-----------------------|------------|
| MARVIN GARDEN         | GO TO JAIL |
| PACIFIC AVENUE        | 3000       |
| NORTH CAROLINA AVENUE | 3000       |
| COMMUNITY CHEST       | 3000       |
| PENNSYLVANIA AVENUE   | 3200       |
| SHORT LINE            | 2000       |
| CHANCE                | 2000       |
| PARK PLACE            | 3500       |
| LUXURY TAX            | 1000       |
| BOARDWALK             | 4000       |



# Startup Statistics

$P(\text{startup success}) = 20\%$ , independent of previous attempts

Expected # startups till first success

$$X \sim G_{0.2} \qquad E(X) = \frac{1}{.2} = 5$$

## Home-Grown Entrepreneur

One of first three  
startups succeeds

Dad will fund up to three startups     $P(\text{success})?$

$$P(X \leq 3) = F(3) = 1 - (0.8)^3 \approx 0.49$$

# Cry Uncle

Even wealthier uncle funds next three startups (4,5,6)

P(success with uncle if dad's help did not suffice)?

$$\begin{aligned}P(X \in \{4, 5, 6\} | X > 3) &= P(4 | X > 3) + P(5 | X > 3) + P(6 | X > 3) \\&= P(1) + P(2) + P(3) = P(X \leq 3) \approx 49\%\end{aligned}$$

P(success with uncle)?  1,2,3 failed but one of 4, 5, 6 succeeded

$$\begin{aligned}P(3 < X \leq 6) &= P(X > 3 \cap X \leq 6) = P(X > 3) \cdot P(x \leq 6 | x > 3) \\&= (0.8)^3 \cdot 0.49 \approx 25\%\end{aligned}$$

$P(X_1, X_2, X_3 \text{ failed}) = q^3$

$$\begin{aligned}P(3 < X \leq 6) &= F(6) - F(3) = (1 - 0.8^6) - (1 - 0.8^3) \\&= 0.8^3 - 0.8^6 \approx 25\%\end{aligned}$$

# Foreign-Born Entrepreneur

$X$  - time to first success       $p=0.2$

$r^X$  - fraction of company you keep       $r=0.5$

$$\begin{aligned} E(r^X) &= \sum_{k=1}^{\infty} r^k P(X = k) = \sum_{k=1}^{\infty} p q^{k-1} r^k = pr \sum_{i=0}^{\infty} (qr)^i \\ &= \frac{pr}{1-qr} = \frac{0.2 \cdot 0.5}{1-0.8 \cdot 0.5} = \frac{0.1}{1-0.4} = \frac{0.1}{0.6} \approx 16.67\% \end{aligned}$$



# Coupon Collector Problem



**MONOPOLY** © BRAND

**COLLECT  
& WIN!**

Complete Winning Combinations  
to win awesome prizes!



**GAME BOARD**

|       |                       |  |
|-------|-----------------------|--|
| \$200 | NEW YORK AVENUE       |  |
| \$180 | TENNESSEE AVENUE      |  |
|       | COMMUNITY CHEST       |  |
| \$180 | ST. JAMES PLACE       |  |
| \$200 | PENNSYLVANIA RAILROAD |  |
| \$160 | VIRGINIA AVENUE       |  |
| \$140 | STATES AVENUE         |  |
| \$150 | ELECTRIC COMPANY      |  |
| \$140 | ST. CHARLES PLACE     |  |

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|  |                       |           |
|--|-----------------------|-----------|
|  | PACIFIC AVENUE        | \$300     |
|  | NORTH CAROLINA AVENUE | \$300     |
|  | COMMUNITY CHEST       |           |
|  | PENNSYLVANIA AVENUE   | \$320     |
|  | SHORT LINE            | \$200     |
|  | CHANCE                |           |
|  | PARK PLACE            | \$350     |
|  | LUXURY TAX            | PAY \$100 |
|  | GO WALK               | \$400     |



# Pre **GROUPON**

n coupons

Each item contains one coupon selected uniformly

Collect all coupons, get a prize



How many items need to buy to collect all?

# Expectation

$X$  - # items to collect all coupons

$n = 3$     Items    1   2   3   4   5   6   7     $X = 7$     EX?

Coupon    2   2   3   2   3   3   1

$$X_1 = 1 \quad X_2 = 3 - 1 = 2 \quad X_3 = 7 - 3 = 4$$

$X_i$  - # items to get  $i^{\text{th}}$  coupon after getting  $i - 1$  coupons

$$X = X_1 + X_2 + X_3$$

$$7 = 1 + 2 + 4$$

$$\left. \begin{array}{l} X_1 = 1 \\ X_2 \sim G_{2/3} \\ X_3 \sim G_{1/3} \end{array} \right\} \perp$$

# General n

$$X_i \sim G\left(\frac{n-(i-1)}{n}\right) = G\left(\frac{n-i+1}{n}\right)$$

$$EX_i = \frac{n}{n-i+1}$$

$$X = \sum_{i=1}^n X_i$$

$$EX = \sum_{i=1}^n EX_i = \sum_{i=1}^n \frac{n}{n-i+1} = \frac{n}{n} + \frac{n}{n-1} + \frac{n}{n-2} + \dots + \frac{n}{1}$$

$$= n\left(\frac{1}{1} + \frac{1}{2} + \dots + \frac{1}{n}\right) = nH_n \approx n \ln n + 0.577n$$

Harmonic Sum  $H_n = \frac{1}{1} + \frac{1}{2} + \dots + \frac{1}{n} \rightarrow \ln n + 0.577\dots$



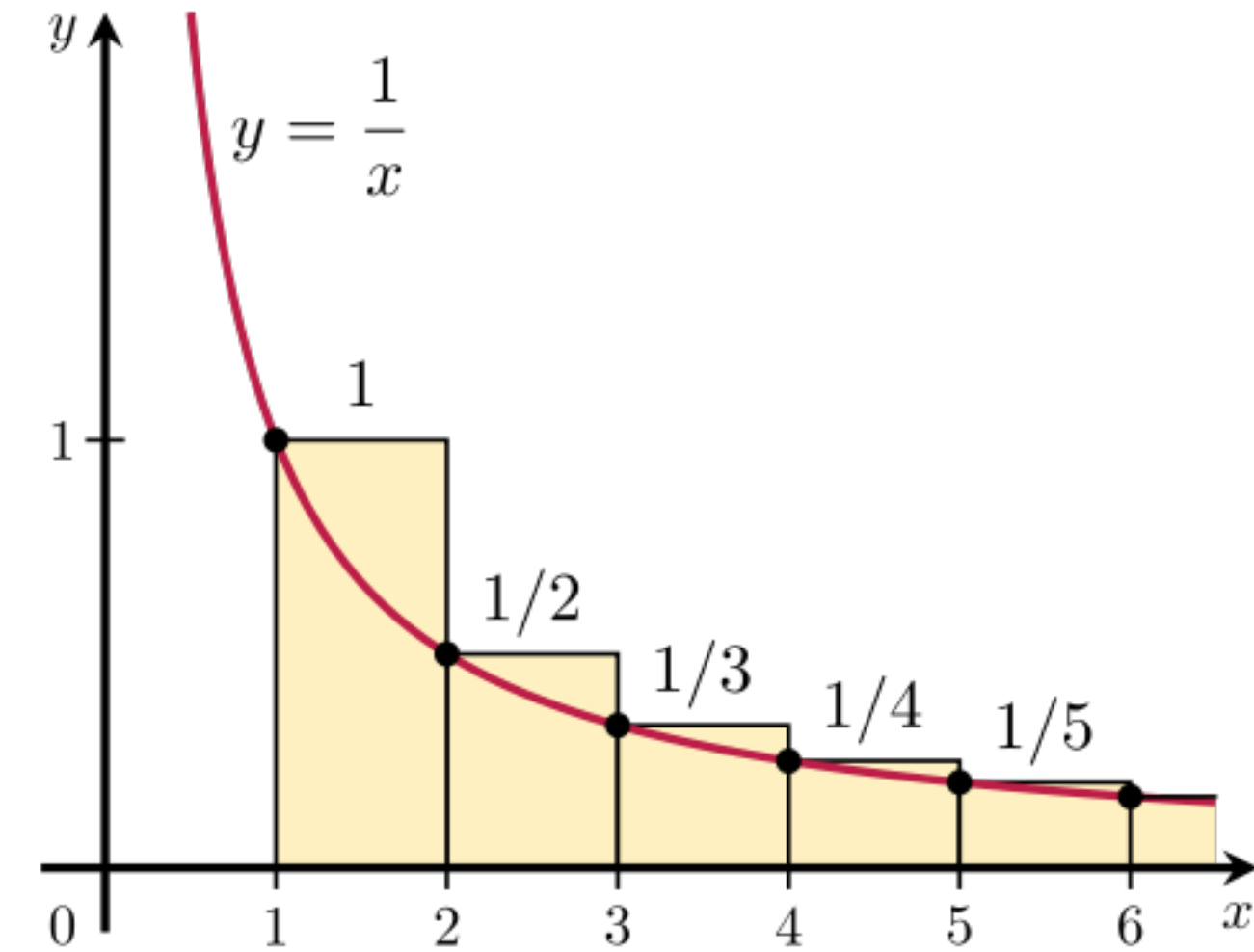
# Harmonic Sum

$$H_n > \int_1^{n+1} \frac{1}{x} dx$$

$$= \ln x \Big|_1^{n+1} = \ln(n+1)$$

$$H_n \leq 1 + \int_1^n \frac{1}{x} dx = 1 + \ln x \Big|_1^n = 1 + \ln n$$

$$H_n \rightarrow \ln n + 0.577 \dots$$



# Variance

$$X \sim G(P)$$

$$V(X) = \frac{1-p}{p^2} \leq \frac{1}{p^2}$$

$$V(X) = V\left(\sum_{i=1}^n X_i\right)$$

$$\stackrel{\textcircled{\parallel}}{=} \sum_{i=1}^n V(X_i)$$

$$\leq \sum_{i=1}^n \frac{1}{\left(\frac{n-i+1}{n}\right)^2}$$

$$= n^2 \left( \frac{1}{n^2} + \frac{1}{(n-1)^2} + \dots + \frac{1}{1^2} \right)$$

$$\leq \frac{\pi^2}{6} n^2$$

$$\sigma \leq \frac{\pi}{\sqrt{6}} n$$



# Summary

Geometric-distribution examples

Coupon collector problem

Discrete distribution families

Bernoulli, Binomial, Poisson, Geometric

