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# CPSC 531: System Modeling and Simulation

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- “The generation of random numbers is too important to be left to chance” - Steve Park (R. Coveyou)
- Main messages:
  - Need great rigour in design and use of (P)RNG
  - Need great care in RVG process as well (avoid GIGO!)
  - Verification and validation apply here as well!

- Common Discrete Distributions
- Common Continuous Distributions
- RVG Testing
  - Uniformity
  - Independence
  - Mean and variance
  - Central tendency: mean, median, mode
  - Extreme values: min and max
  - Visual appearance: pdf and CDF
  - Autocorrelation properties

- Discrete Uniform( $a,b$ ) (also called EquiLikely( $a,b$ ))
  - Choosing at random from a finite set of discrete items
  - Examples: dice, cards, balls in urn, socks in drawer
- Bernoulli( $p$ )
  - Binary outcome from an experiment: success ( $p$ ) or failure ( $1-p$ )
  - Examples: coin toss, defective component, packet error
- Geometric( $p$ )
  - Often arises from counting process for a Bernoulli RV
  - Example: how many tosses before the first 'Tail' occurs
- Binomial( $n,p$ )
  - Another type of counting process applied to Bernoulli RV
  - Example: how many 'Heads' in  $n$  tosses of a coin
- Poisson( $\lambda$ )
  - Often arises from counting process for an Exponential RV
  - Limiting case of Binomial RV when  $n$  approaches infinity
  - Example: how many traffic accidents in Calgary yesterday

# Summary: Common Discrete Random Variables

Type	pdf	CDF	Mean	Variance
EquiLikely(a,b)	$1/(b-a+1)$	$(x-a+1)/(b-a+1)$	$(a+b)/2$	$((b-a+1)^2-1)/12$
Bernoulli(p)	$p^x(1-p)^{1-x}$	$(1-p)^{1-x}$	$p$	$p(1-p)$
Geometric(p)	$p^x(1-p)$	$1-p^{x+1}$	$p/(1-p)$	$p/(1-p)^2$
Binomial(n,p)	$\binom{n}{x} p^x(1-p)^{n-x}$	See textbook	$np$	$np(1-p)$
Poisson( $\lambda$ )	$\lambda^x e^{-\lambda}/x!$	See textbook	$\lambda$	$\lambda$

- Continuous Uniform( $a,b$ ) (note that  $U(0,1)$  is a special case!)
  - Choosing at random from a specified range of (continuous) values
  - Examples: temperature, rainfall, message size, weight of a package
- Exponential( $\lambda$ )
  - Often a good model for “random” events (arrivals, duration)
  - Single parameter  $\lambda$  represents “rate”, while mean  $\mu = 1/\lambda$
  - Examples: accidents, earthquakes, lightning, hole-in-one, phone calls
- Standard Normal( $0,1$ )
  - The classic “Bell Curve” with zero mean and unit variance
  - Examples: statistical noise, normalized residual errors
- Normal( $\mu,\sigma$ )
  - A generalized Gaussian with mean  $\mu$  and standard deviation  $\sigma$
  - Often arises when summing other RVs (via central limit theorem)
  - Examples: height, weight, IQ, test scores of a (human) population

Type	pdf	CDF	Mean	Variance
Uniform(a,b)	$1/(b-a)$	$(x-a)/(b-a)$	$(a+b)/2$	$(b-a)^2/12$
Exponential( $\lambda$ )	$\lambda e^{-\lambda x}$	$1 - e^{-\lambda x}$	$1/\lambda$	$1/\lambda^2$
Normal(0,1)	See textbook	$\Phi(z)$	0	1
Normal( $\mu, \sigma$ )	See textbook	$\Phi((x-\mu)/\sigma)$	$\mu$	$\sigma^2$

- Uniformity: Chi-square test (discussed last week)
- Independence: KS-test (discussed last week)
- Other tests and utilities:
  - avg.c: sample mean, sample variance, sample std deviation
  - buckets.c: compute histogram (pmf or pdf) of data
  - Check the central tendencies: mean, median, and mode
  - Check the extreme values: minimum and maximum
  - Plot the pdf and look at it visually: does it look right?
  - Plot the CDF and look at it viually: does it look right?
  - autocorr.c: compute autocorrelation coefficients to see if RV is correlated with itself at different time lags