### Welcome

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Link to colab notebook:
https://colab.research.google.com/drive/1JF3PVHAtANERpZkVkxYRgcLmhTuoFlzu?usp=sharing

#### Goals

Introduce students to the Central Limit Theorem (CLT)

Provide examples of Applications of the the Central Limit Theorem

Hypothesis Testing (TBD)

#### Prerequisites

Basic Python coding skills

#### Why central limit theorem

Example: performance profiling

Represents the most confused and misinterpreted fundamental topics in Statistics

#### Q: What is central limit theorem

The central limit theorem states that if you have a population with mean  $\mu$  and standard deviation  $\sigma$  and take sufficiently large random samples from the population with replacement, then the distribution of the sample means will be normal.

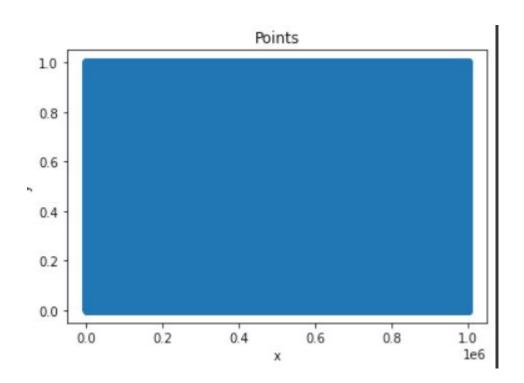
#### Properties of the distribution of sample means

Mean of the sample means = mean of the population Standard deviation of the sample means = standard deviation of the population / sqrt(n), where n - sample size

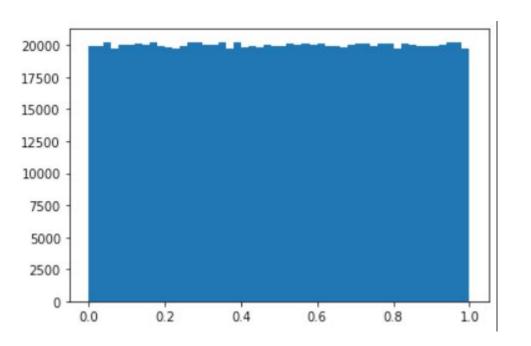
#### Example

Generate population of 10K floating point numbers uniformly distributed in the range of 0 to 1

#### Scatter plot of population (size of 1M)

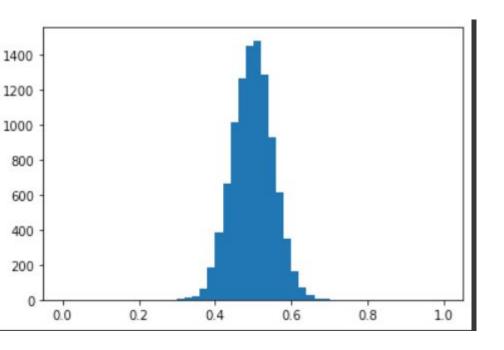


### Histogram of the population



1m items 50 bins 20k = 1M/50

#### Let's build a distribution (histogram) of the sample means

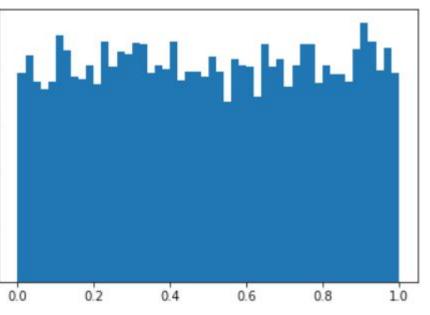


Number of samples = 10k Sample size = 30 Mean = 0.5 (population mean) Standard deviation = Population Standard deviation / sqrt(30)

# Q: Change the number of samples and sample size in a systematic way

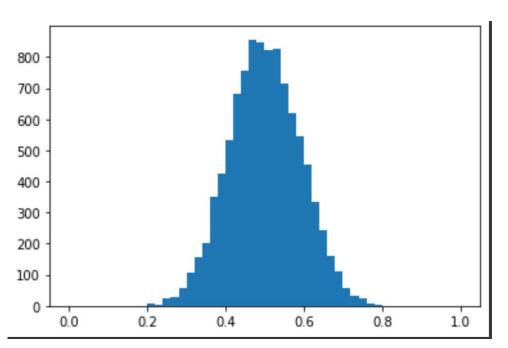
Number of samples\Sample size	1	10	30+
High	Population	Student	Normal
Low	Unknown	Unknown	Unknown (centered around mean)

## Number of samples=10k and sample size=1 (the same distribution)



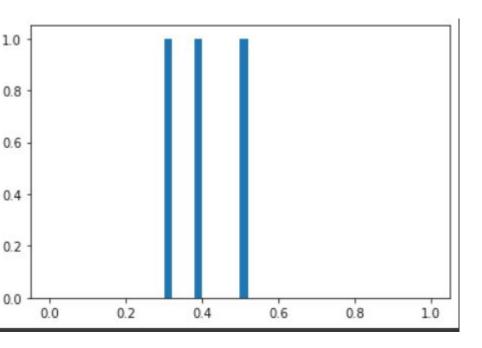
Number of samples = 10k Sample size = 1 Mean = 0.5 (population mean) Standard deviation = Standard deviation Variance / sqrt(1)

#### Number of samples=10k and sample size=10 (t student)



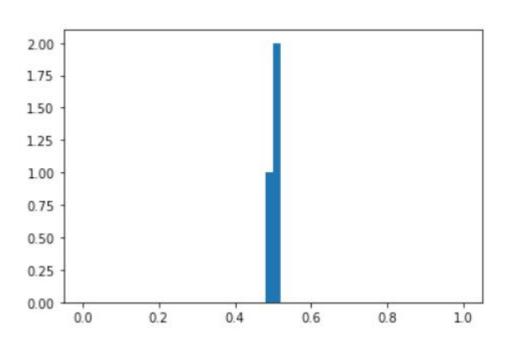
Number of samples = 10k Sample size = 10 Mean = 0.5 (population mean) Standard deviation = Standard deviation Variance / sqrt(10)

#### Number of samples=3 and sample size=10 (unknown)



Number of samples = 3
Sample size = 10
Mean = 0.5 (population mean)
Standard deviation = Population
Standard deviation / sqrt(3)

# Number of samples=3 and sample size=3000 (unknown, but centered around the population mean)



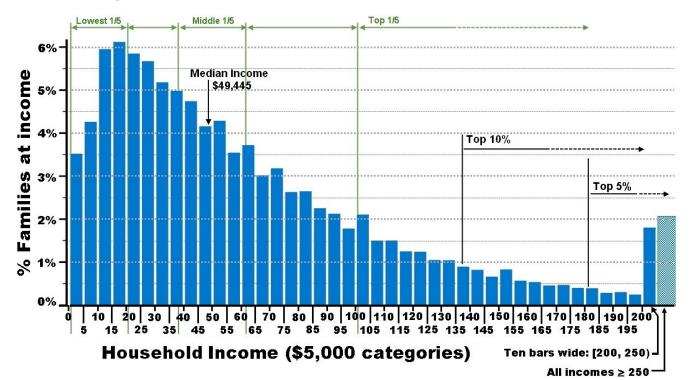
Number of samples = 3000 Sample size = 3 Mean = 0.5 (population mean) Standard deviation = Population Standard deviation / sqrt(3)

### Summary

Number of samples\Sample size	1	10	30+
High	Population	Student	Normal
Low	Unknown	Unknown	Unknown (centered around mean)

#### Applications 1: population distribution is not normal

Estimating the distribution of household income: mean and standard deviation



#### Applications 2: population distribution is normal

Measurement errors: performance profiling. Mean and Standard deviation can give us even more information about the underlying distribution.

Sample size = number of measurements

Number of samples = number of experiments

One experiments is comprised of multiple measurements

Mean of the population = Mean of sample means

Standard deviation of the population = standard deviation of the sample means \* sqrt(sample size)

Hypothesis Testing (TBD)

Thank you for your time and attention