### **T**-distribution

• Guinness



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• But first...a quick review of the Z-distribution



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• T-distribution: comparing sample means, small sample sizes

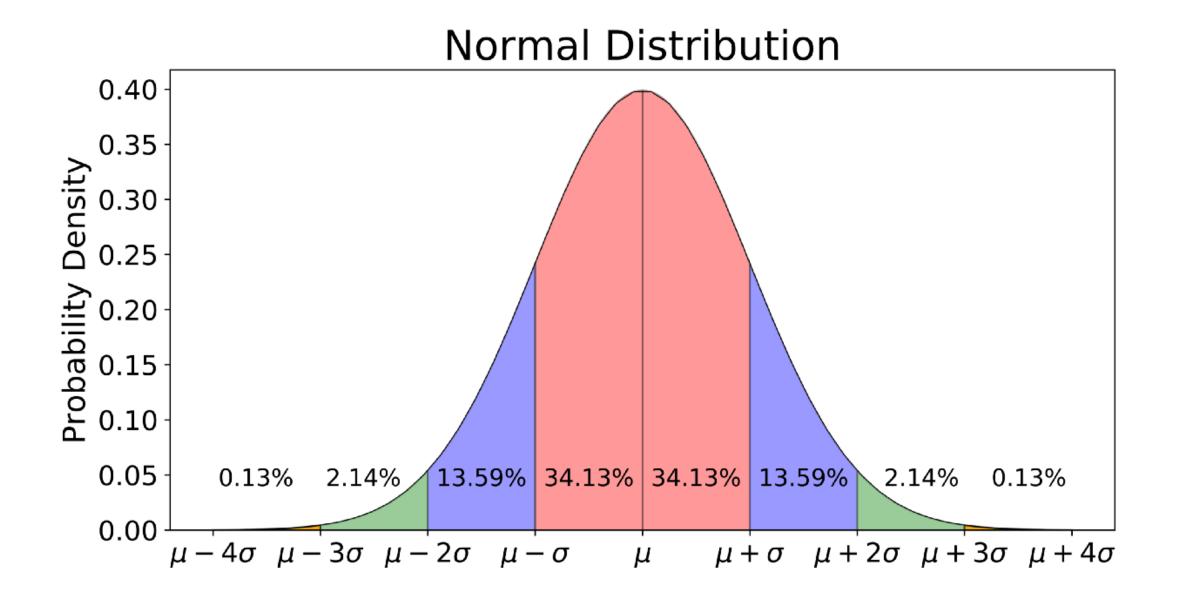


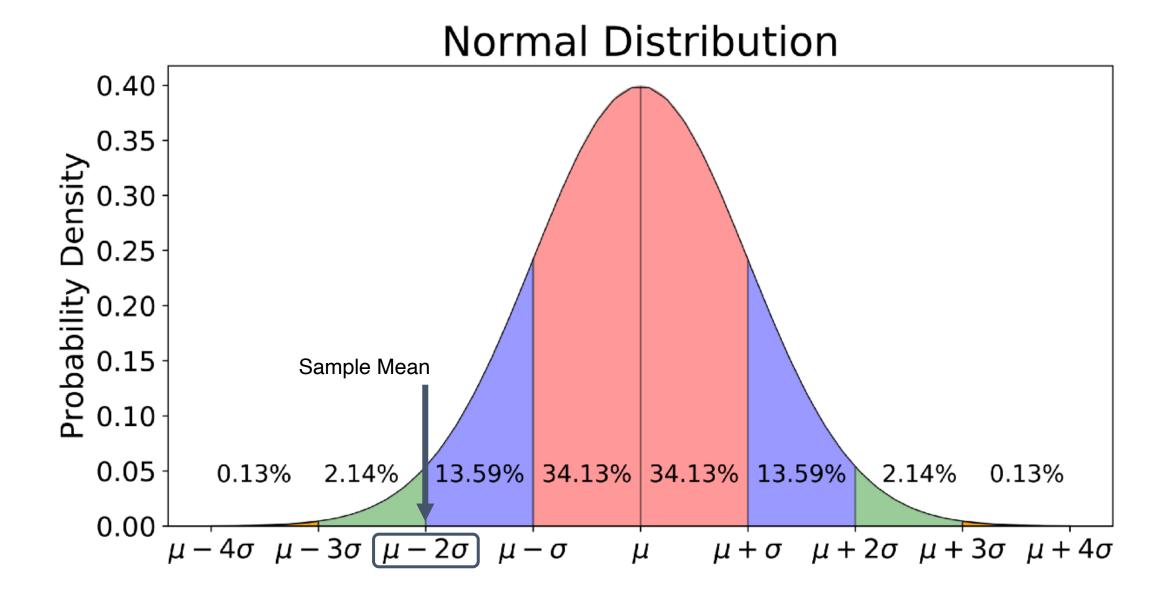
## Review of Z-distribution

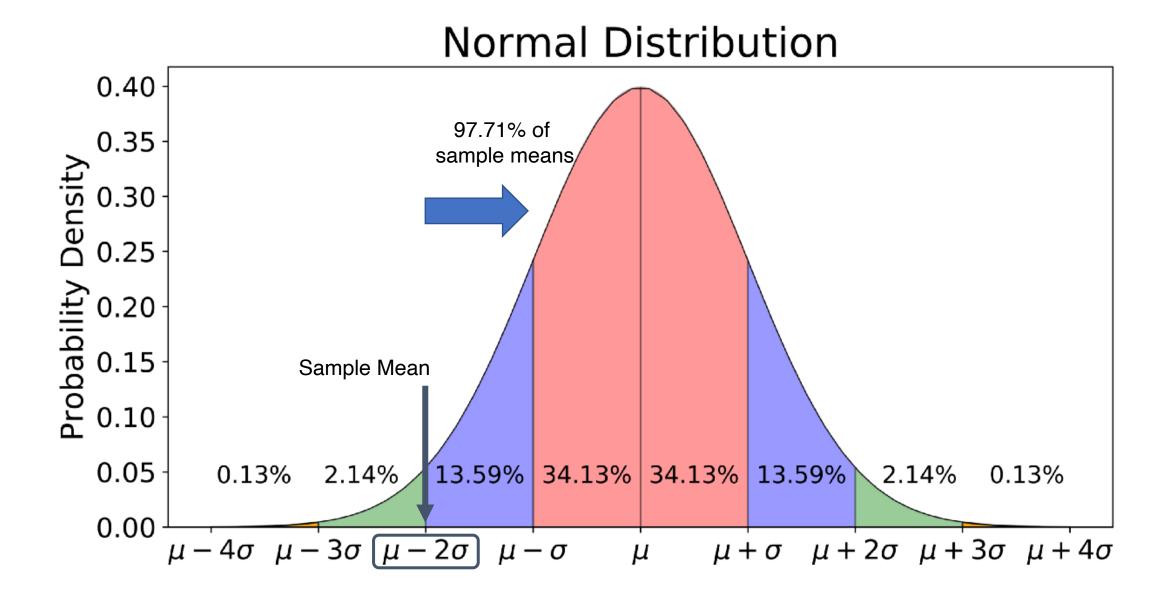
• The Z-distribution can be used to test differences in means

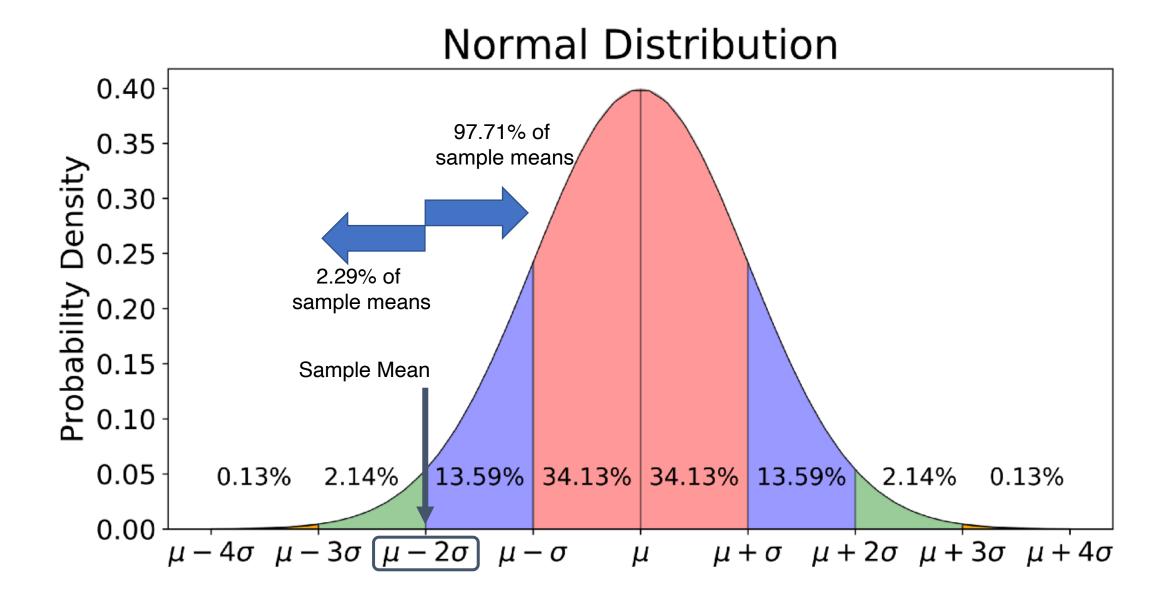
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  - \*When the population parameters are known\*
- Known probability of a sample mean  $(\bar{x})$  given the population mean  $(\mu)$  and standard deviation  $(\sigma)$  / variance  $(\sigma^2)$









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Variance Formulas: 
$$\sigma^{2} = \frac{\sum_{i=1}^{N} (X_{i} - \overline{X})^{2}}{N} \qquad s^{2} = \frac{\sum_{i=1}^{N} (X_{i} - \overline{X})^{2}}{N-1}$$

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### Student's T-distribution

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- T-distribution helps to account for additional uncertainty

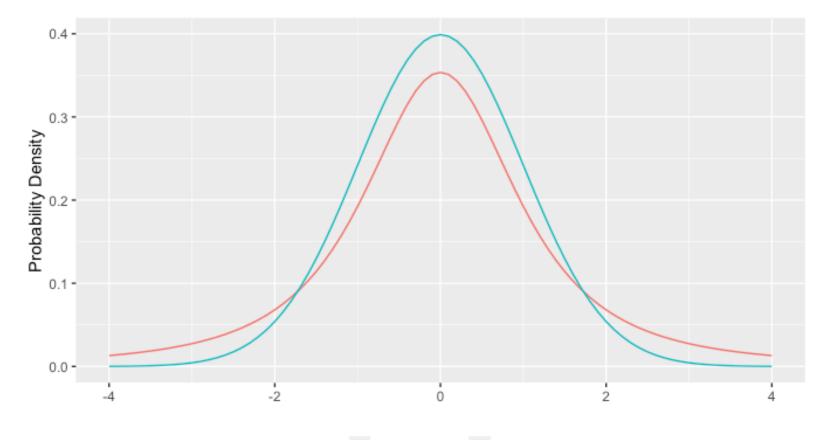


#### How the T-distribution Works

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T distr. df = 2 — Z distr.

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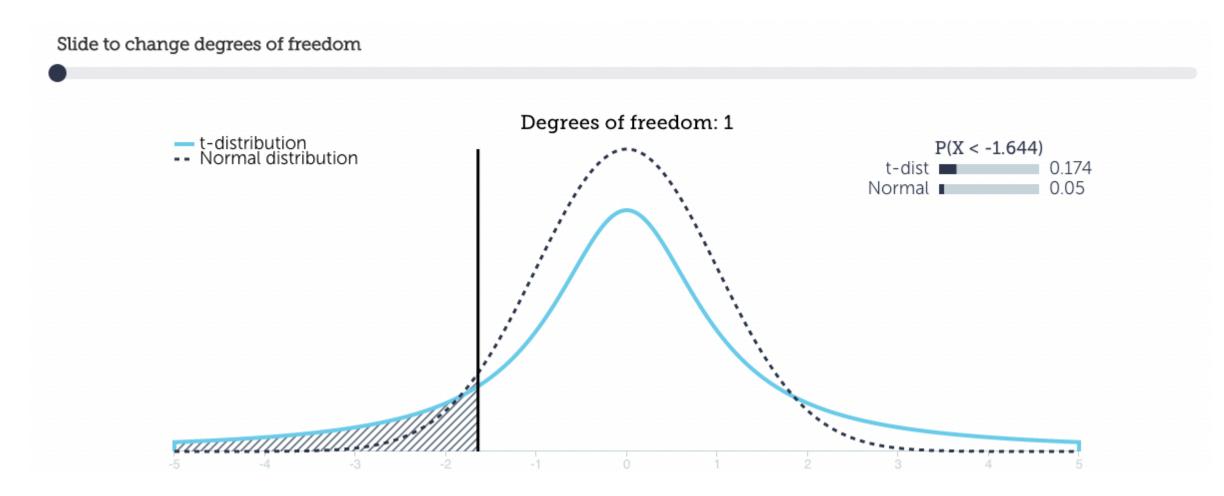
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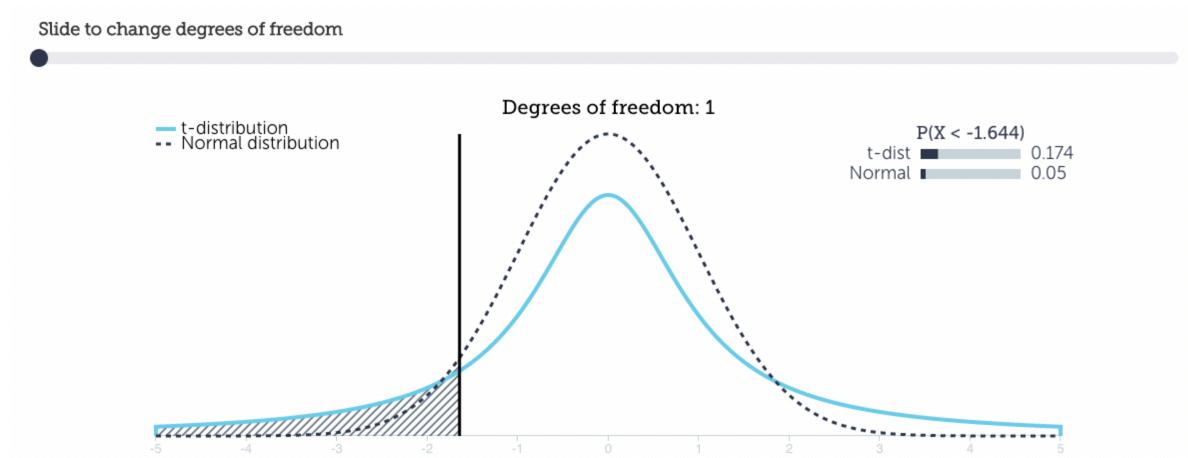
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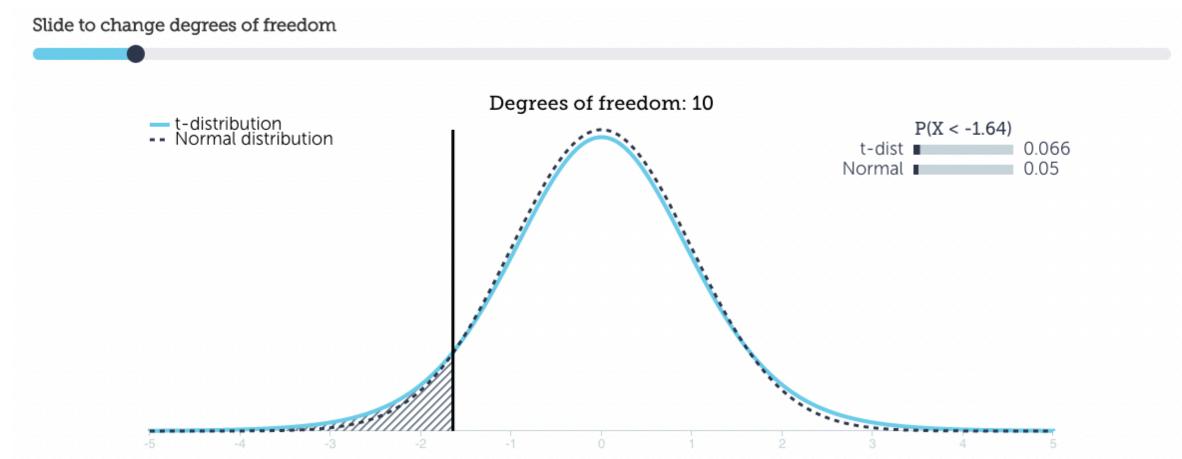
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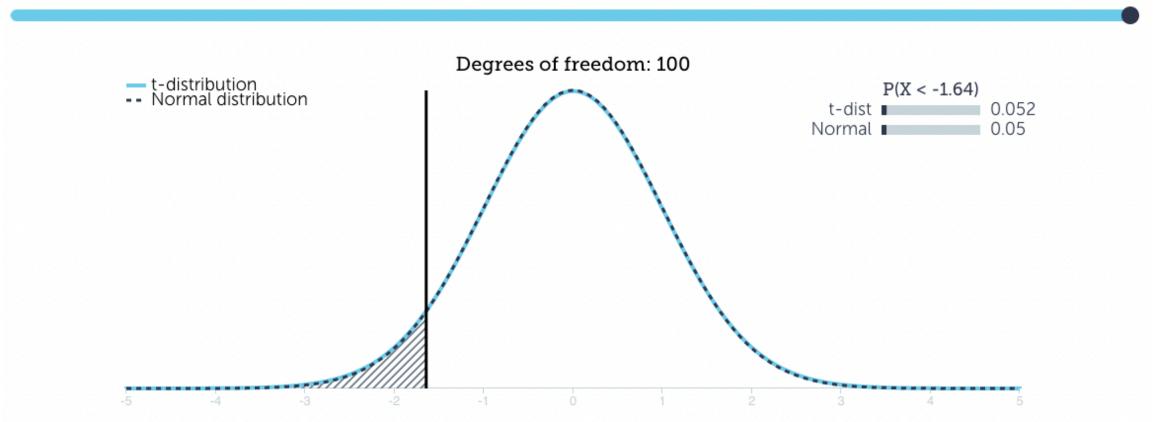


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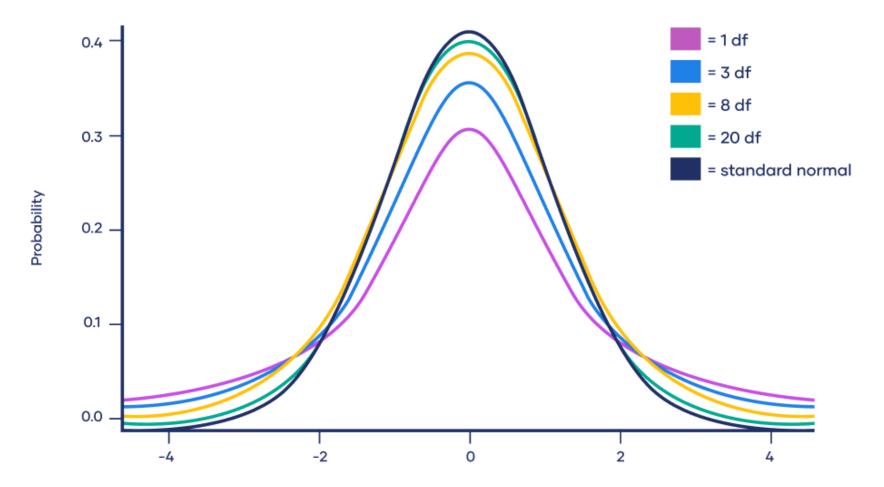
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Slide to change degrees of freedom



T-distribution becomes the Z-distribution when df goes to infinity

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T-score (no. standard deviations from the mean)

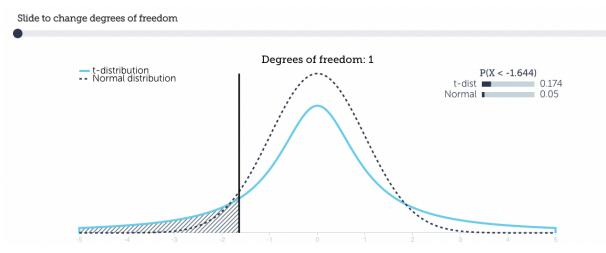
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- At small degrees of freedom, the T-distribution has "thick tails" = more probability for extreme values

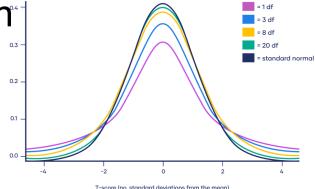


#### TLDR: T-Distribution

• When do not know the population variance and have small sample sizes, we need to adjust our expectations for sampling variation

 At small degrees of freedom, the T-distribution has "thick tails" = more probability for extreme values

 As sample size increases (large df's), the T-distribution becomes more and more similar to the Z-distribution



# Questions?

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