
Spring 2019

## Lecture 17

Pseudo Random Numbers

## Announcements

- Project 2: Posted Monday.

Due Tuesday, April 9 and April 16

- Prelim 2: In-class. Tuesday, April 16 (Not Tuesday after spring break)


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Campus Chapter

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## Continuous Random Variables

## Clicker Question:

Is it possible for someone to be exactly six feet (72 inches) tall?

- A: Yes
- B: No
- C: Impossible to tell


## Zehn Deutsche Mark



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## Uniform Distribution on (a,b)

Informally: All values in the interval $(a, b)$ are equally likely

More formally: Every interval of the same width within ( $a, b$ ) has the same probability

How to simulate a random sample from a uniform distribution?

## Linear Congruential Generator (LCG)

Generate a sequence of integers as follows:

$$
X_{n+1}=\left(a X_{n}+c\right) \bmod m
$$

where $a=1103515245, \quad c=12345$
and $\quad m=2^{31}$. Set $U_{n+1}=X_{n+1} / m$

## Does the LCG work?

Does the LCG generate samples that are indistinguishable from random samples from the uniform distribution?

Null Hypothesis: The LCG generates random samples from the uniform distribution

Alternative Hypothesis: The LCG does not generate samples from the uniform distribution

## Chi-square Statistic

- Divide the unit interval into 10 non-overlapping intervals of equal width 0.1
- Determine the observed and expected counts in each interval
- Calculate test statistic:

$$
\chi^{2}=\sum \frac{(O-E)^{2}}{E}
$$

## Null Distribution!

Cannot use LCG generated values to test the validity of LCG as a uniform random number generator!

Statistical theory shows that the null distribution of the chi-square statistic has a particular form: a chi-square distribution

We can compare the LCG-simulated histogram of chi-square values to what the theory predicts

## One- versus Two-sided Tests

## - Mendel's Peas

Null Hypothesis: Probability of purple flower is $0.75(p=0.75)$
Alternative Hypothesis: Probability is not 0.75 ( $p!=0.75$ )
Test Statistic: | p_hat - 0.75|
Two-sided test: 'Large' deviation from the null in either direction leads to rejection (of the null hypothesis)

- Jelly Beans

Null Hypothesis: No effect on the probability of acne ( $p=0.2$ ) Alternative Hypothesis: Increase the probability of acne ( $p>0.2$ ) Test Statistic: p_hat - 0.2

One-sided test: 'Large' positive deviation from the null leads to rejection

## Conclusions From a Test

Fail to reject the null hypothesis (data is not inconsistent with the null hypothesis - inconclusive)
Hypothesis test
Reject the null hypothesis (data is inconsistent with the null hypothesis - accept the alternative)

## Definition of $P$-value

The P -value is the chance,

- under the null hypothesis,
- that the test statistic
- is equal to the value that was observed in the data or is even further in the direction of the alternative.


## Quantifying Conclusions

P (the test statistic would be equal to or more extreme than the observed test statistic under the null hypothesis)


## Conventions of Consistency

- "Inconsistent": The test statistic is in the tail of the null distribution.
- "In the tail," first convention:
- The area in the tail is less than $5 \%$.
- The result is "statistically significant."
"In the tail," second convention:
- The area in the tail is less than $1 \%$.
- The result is "highly statistically significant."


## Can the Conclusion be Wrong?

Yes.

|  | Null is true | Alternative is <br> true |
| :--- | :---: | :---: |
| Test rejects the <br> null | $\times$ | $\checkmark$ |
| Test doesn't <br> reject the null | $\checkmark$ | $\times$ |
| (Demo) |  |  |

## An Error Probability

- The cutoff for the P -value is an error probability.
- If:
- your cutoff is 5\%
- and the null hypothesis happens to be true
- (but you don't know that)
- then there is about a 5\% chance that your test will reject the null hypothesis anyway.

