

Northwestern Campus Safety Check

May 30th 2017

TEAM NEARBY

JASON DONG, WILL FINNEGAN, BEOMSEOK KIM, SAM KIM



Introduction: Objectives

We aim to give students a data-driven way to measure
the safety level around the campus

Introduction: Data Collection

Source of data: University Police Evanston Campus Blotter
(http://www.northwestern.edu/up/blotter/blotter_ev.html)

SECTION I: EVANSTON CAMPUS INCIDENTS

A daily log of incidents reported to the Evanston Police Department can be found at
<http://www.cityofevanston.org/police/reports/daily-crime-reports/>

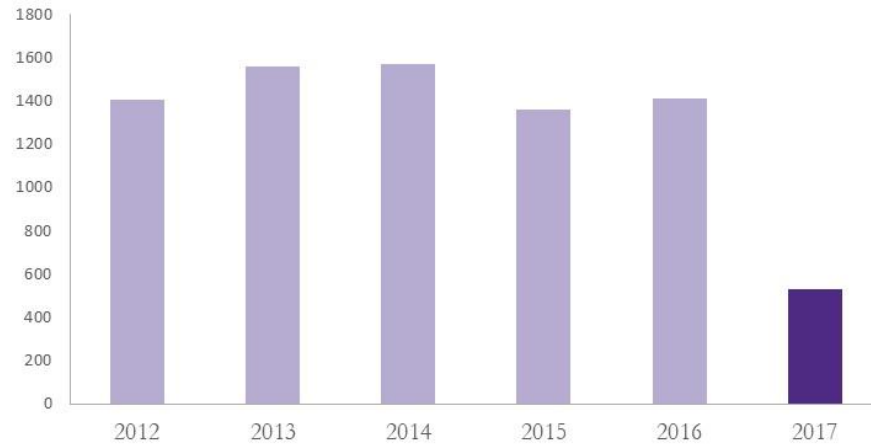
2017|[apr](#)|[mar](#)|[feb](#)|[jan](#)|

2016|[dec](#)|[nov](#)|[oct](#)|[sep](#)|[aug](#)|[jul](#)|[jun](#)|[may](#)|

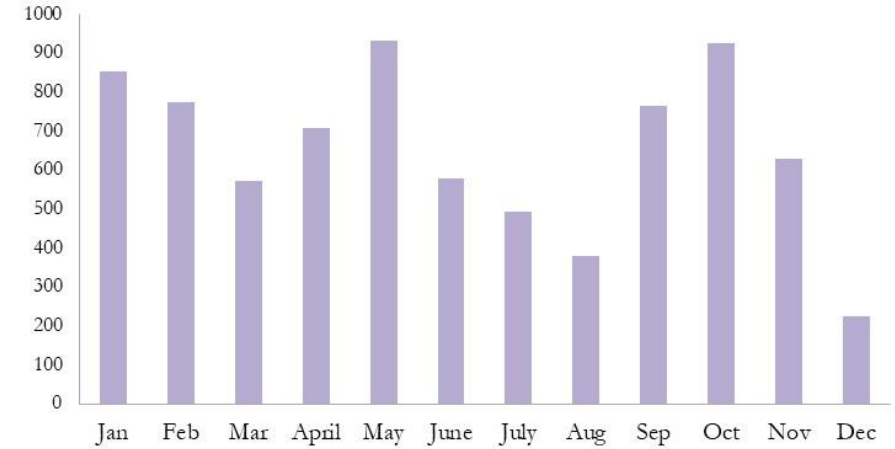
Case Number	2017-00000613
Date & Time: Reported	May 01, 2017 at 11:06:10 AM
Date & Time: Occurred	April 26, 2017 at 4:00:00 PM
	April 28, 2017 at 4:00:00 PM
Location:	2245 SHERIDAN RD
Common Name:	Sargent Hall
Incident Type:	Theft - Bicycle
Criminal Offense:	Theft \$500 and Under
Disposition:	Closed

Brainstorming

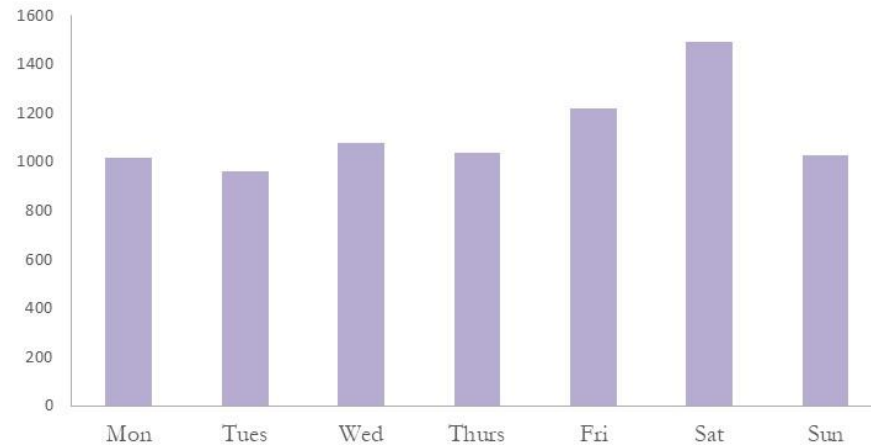
Total Number of Incidents by Year



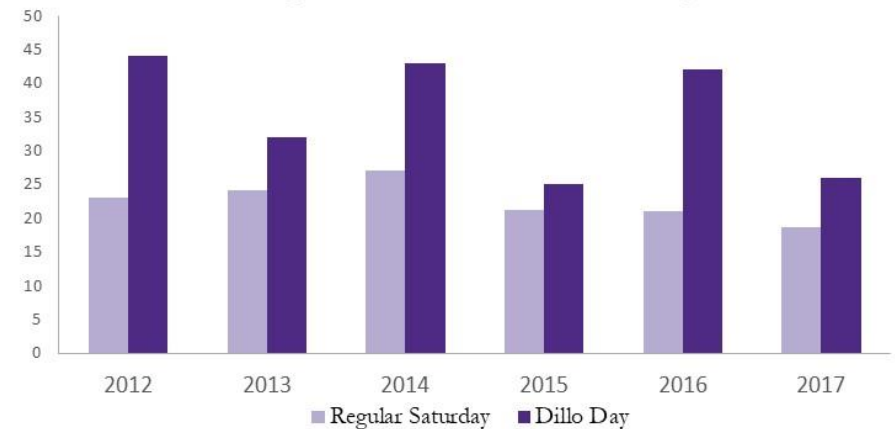
Total Number of Incidents by Month



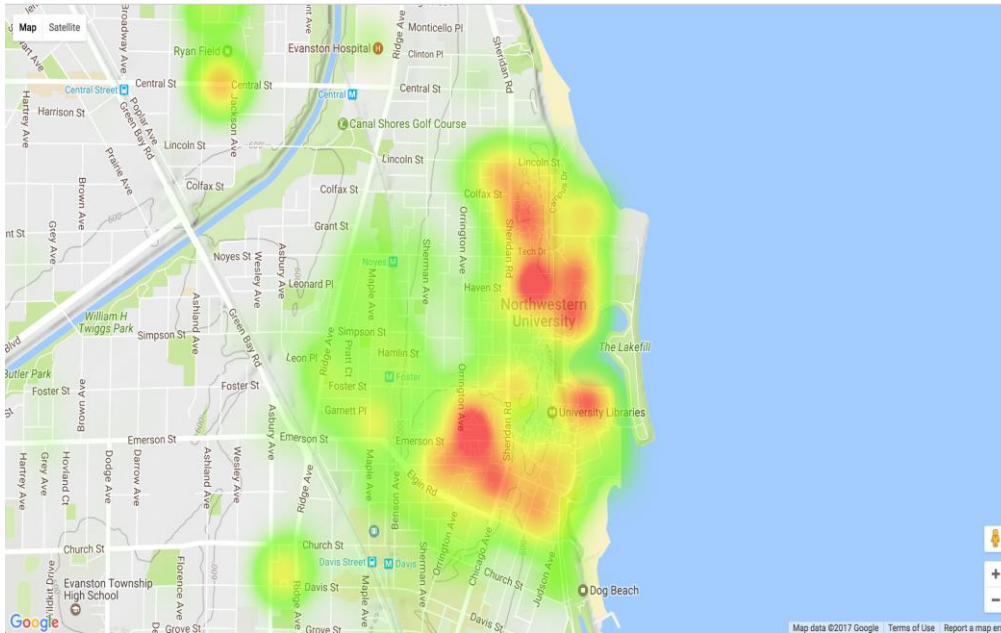
Total Number of Incidents by Day of the Week



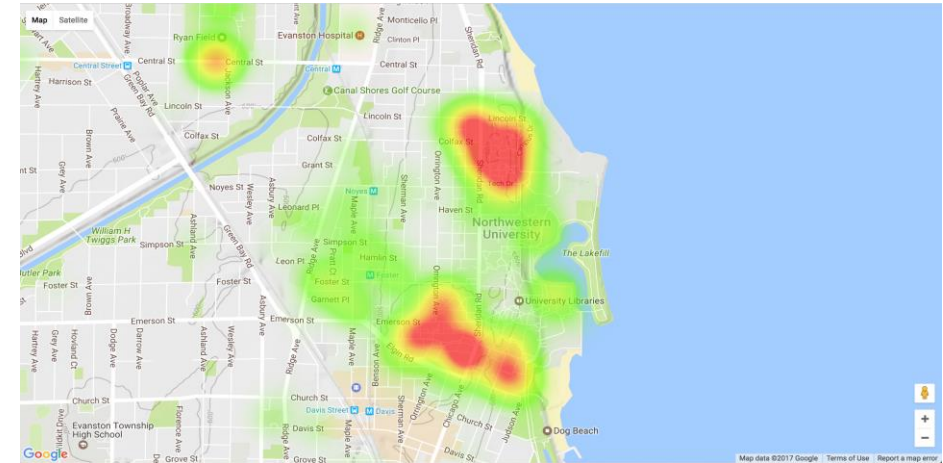
Total Number of Incidents on Dillo Day vs. Average Number of Incidents on Saturday



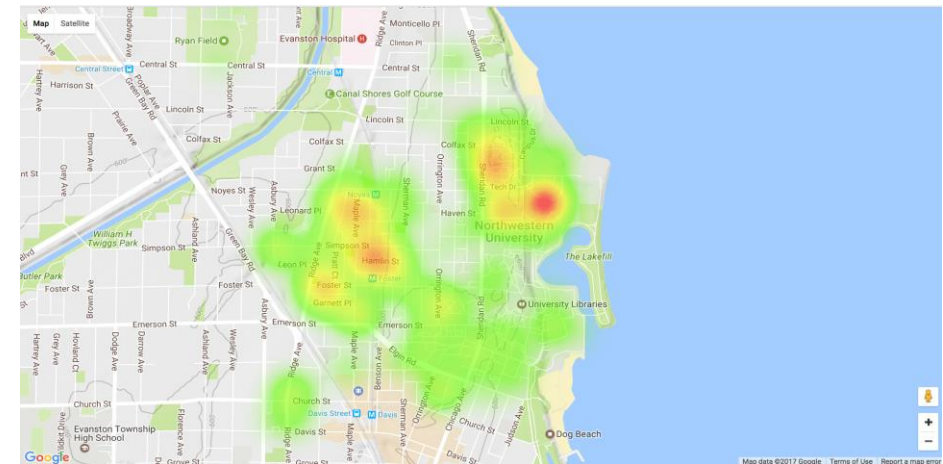
North Campus vs. South Campus



Heatmap of All Incidents



Heatmap of Substance-Related Incidents



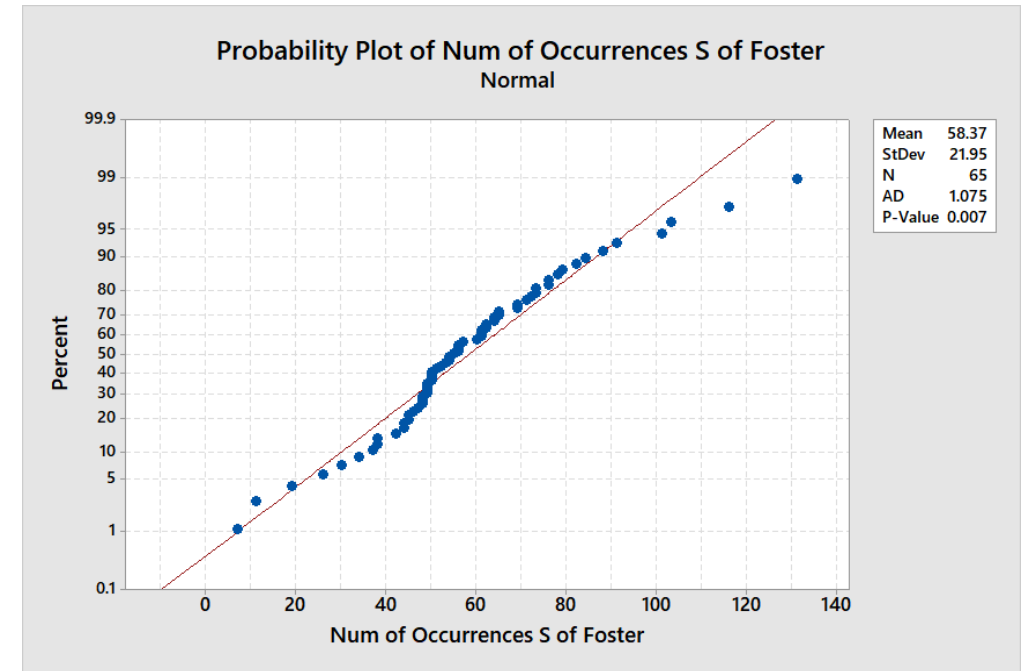
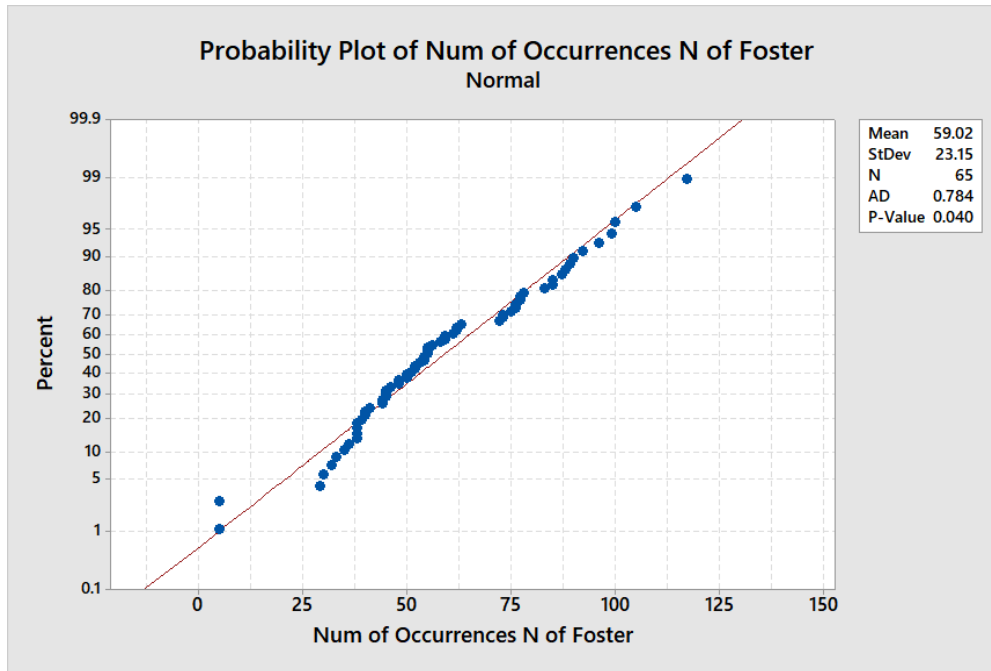
Heatmap of Noise-Related Incidents

Sources: Google Maps.

Our Questions

- Do more incidents take place on the North Campus compared to the South Campus?
- Do more incidents take place on the special occasions like Dillo Day? How do weekends compare to weekdays in general?
- Do more incidents take place on the months when students are on break or months during classes?

North Campus vs. South Campus?



Approximately Normally Distributed

Sources: Minitab.

North Campus vs. South Campus?

Hypothesis Test

$H_0: \mu_1 = \mu_2$ vs. $H_1: \mu_1 \neq \mu_2$ (μ_1 : Average number of incidents North of Foster per month, μ_2 : Average number of incidents South of Foster per month)

Two-Sample T-Test and CI: Num of Occurrences N of Foster, Num of Occurrences S of Foster

Two-sample T for Num of Occurrences N of Foster vs Num of Occurrences S of Foster

	N	Mean	StDev	SE Mean
Num of Occurrences N of	65	59.0	23.1	2.9
Num of Occurrences S of	65	58.4	21.9	2.7

Difference = μ (Num of Occurrences N of Foster) - μ (Num of Occurrences S of Foster)

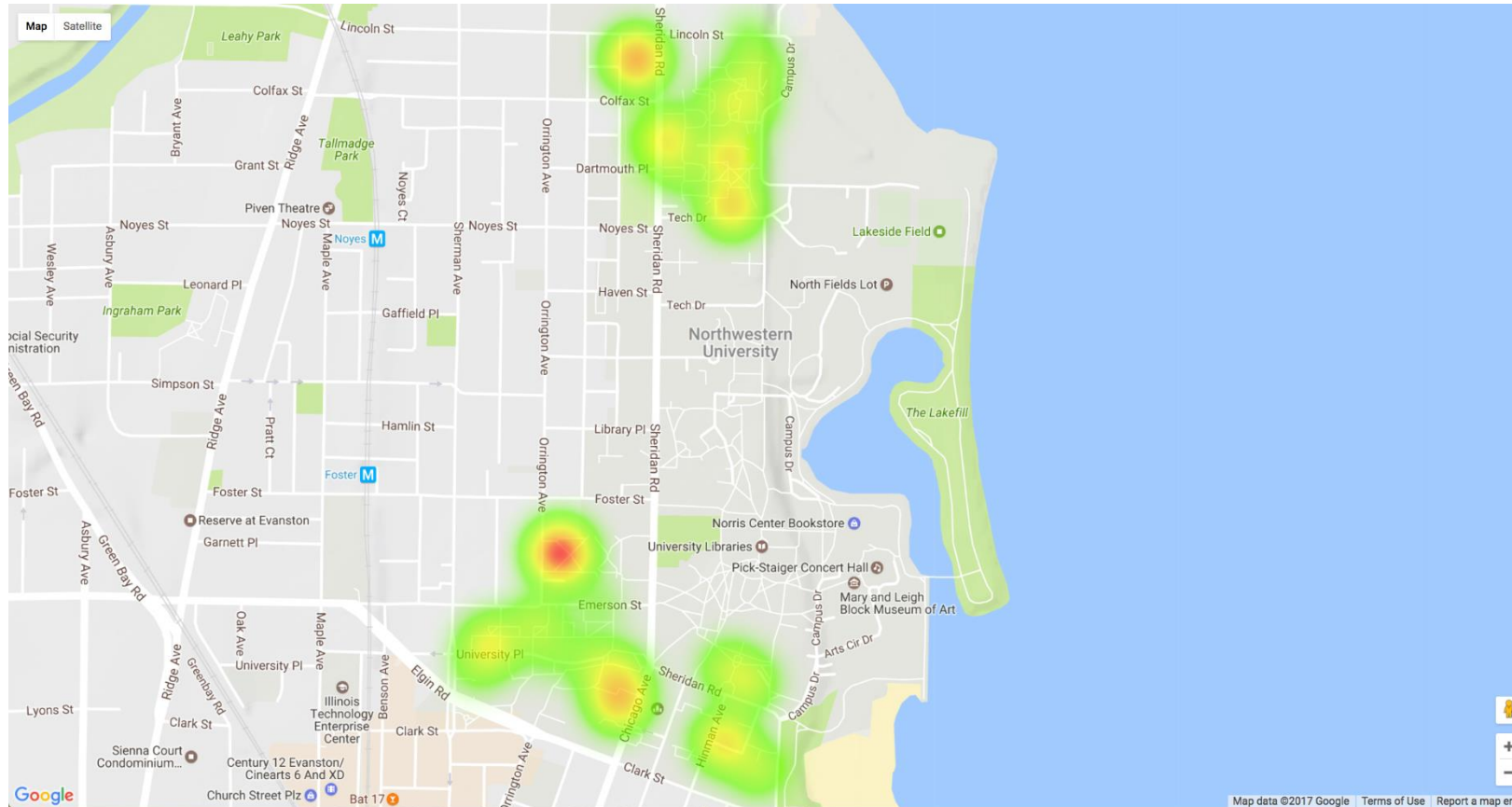
Estimate for difference: 0.65

95% CI for difference: (-7.18, 8.47)

T-Test of difference = 0 (vs \neq): T-Value = 0.16 P-Value = 0.871 DF = 127

Fail to reject H_0 ; Statistically no significant difference

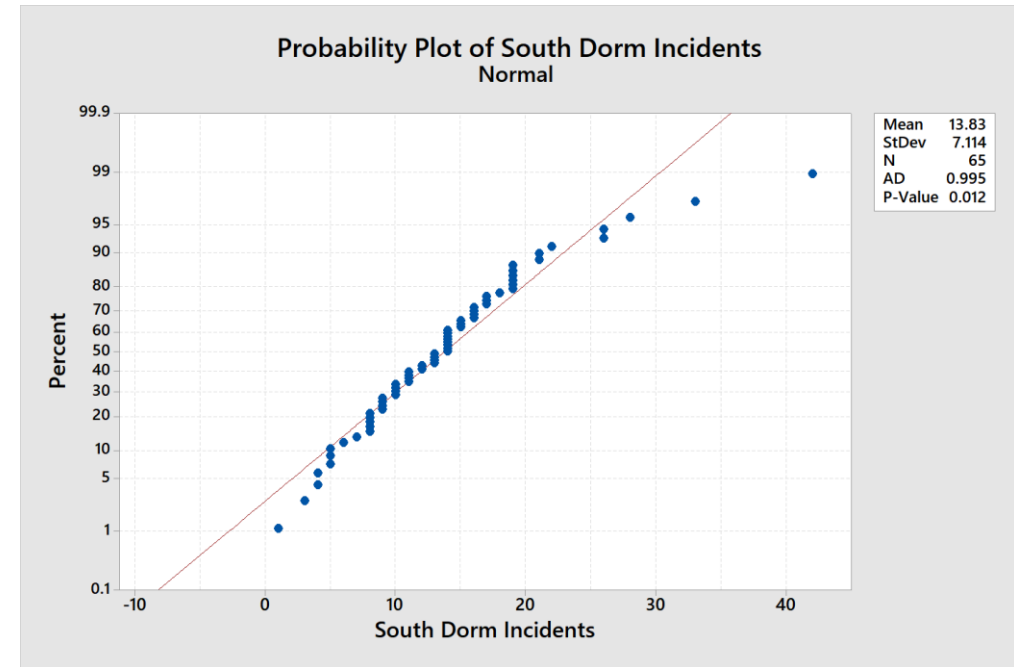
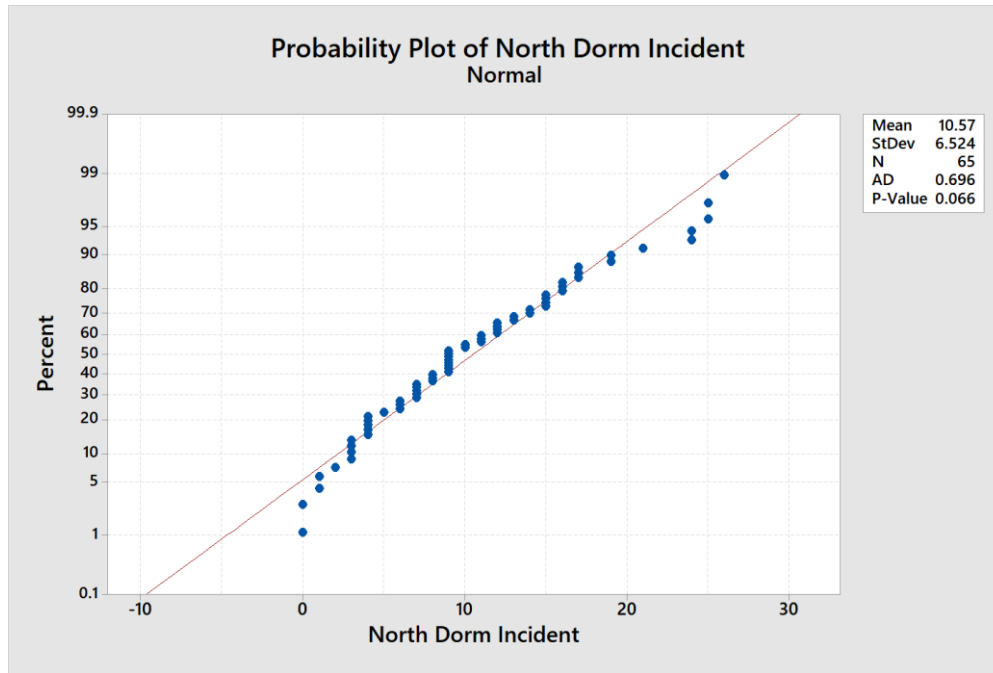
North Dorms vs. South Dorms?



Heatmap of All Incidents in Student Housings only

Sources: Google Maps.

North Dorms vs. South Dorms?



Approximately Normally Distributed

Sources: Minitab.

North Dorms vs. South Dorms?

Hypothesis Test

$H_0: \mu_1 = \mu_2$ vs. $H_1: \mu_1 \neq \mu_2$ (μ_1 : Average number of incidents in North Dorms per month,
 μ_2 : Average number of incidents in South Dorms per month)

Two-Sample T-Test and CI: N, S

Two-sample T for N vs S

	N	Mean	StDev	SE Mean
N	65	10.57	6.52	0.81
S	65	13.83	7.11	0.88

Difference = μ (N) - μ (S)

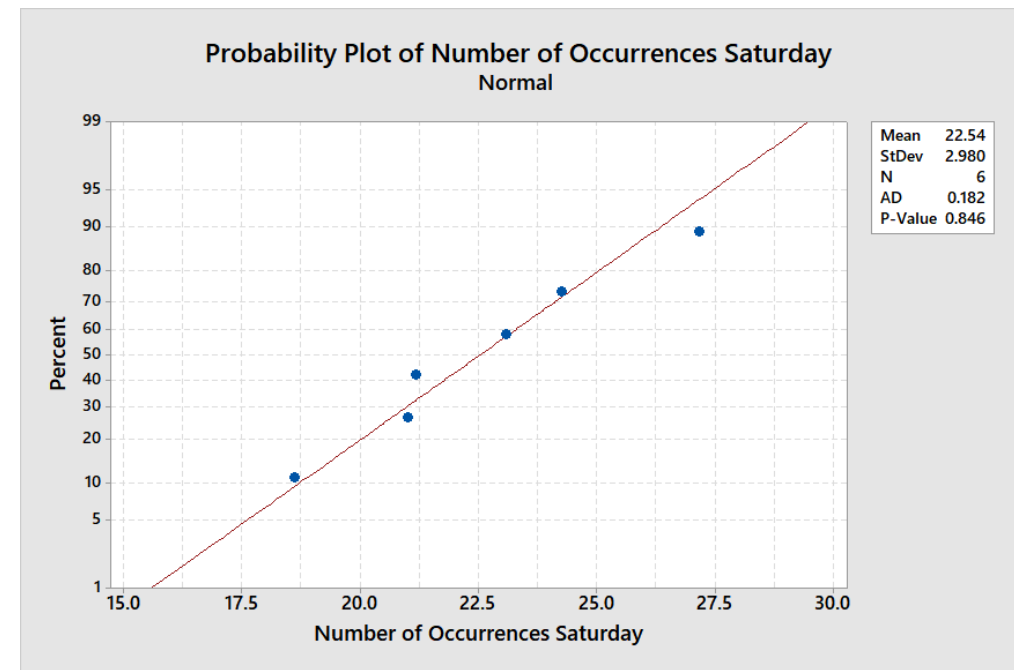
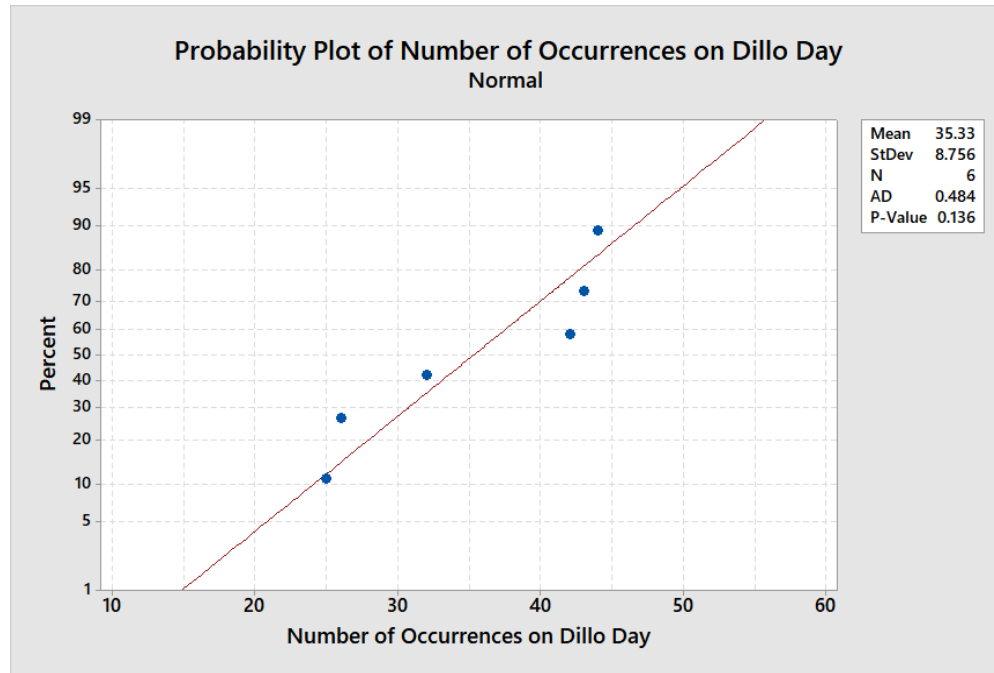
Estimate for difference: -3.26

95% CI for difference: (-5.63, -0.89)

T-Test of difference = 0 (vs \neq): T-Value = -2.72 P-Value = 0.007 DF = 127

Reject H_0 ; Statistically significant difference

How crazy are Dillo Days?



Approximately Normally Distributed

How crazy are Dillo Days?

Hypothesis Test

$$H_0: \mu_1 = \mu_2 \text{ vs. } H_1: \mu_1 \neq \mu_2$$

(μ_1 : Average number of incidents on each Dillo Day,
 μ_2 : Average number of incidents on regular Saturdays)

Two-Sample T-Test and CI: Number of Occurances on Dillo D, Number of Occurances Saturday

Two-sample T for Number of Occurances on Dillo D vs Number of Occurances Saturday

	N	Mean	StDev	SE Mean
Number of Occurances on	6	35.33	8.76	3.6
Number of Occurances Sat	6	22.54	2.98	1.2

Difference = μ (Number of Occurances on Dillo D) - μ (Number of Occurances Saturday)

Estimate for difference: 12.79

95% CI for difference: (3.55, 22.03)

T-Test of difference = 0 (vs \neq): T-Value = 3.39 P-Value = 0.015 DF = 6

Reject H_0 ; Statistically significant difference

How is each day of the week different?

Hypothesis Test

$$H_0: \mu_1 = \mu_2 = \dots = \mu_7 \text{ vs.}$$

$$H_1: \text{at least one } \mu_i \text{ is different}$$

(where each μ_i represents the average number of incidents on a day of the week, Monday through Sunday)

Reject H_0 ; Statistically significant difference

Sources: R.

```
call:
lm(formula = Count ~ ., data = DAY)

Residuals:
    Min       1Q   Median       3Q      Max
-21.969  -5.254  -0.754   3.354  45.031

Coefficients: (1 not defined because of singularities)
              Estimate Std. Error t value Pr(>|t|)
(Intercept)  15.8308     1.0862   14.575 < 2e-16 ***
Mon          -0.1846     1.5361   -0.120  0.9044
Tues         -1.0154     1.5361   -0.661  0.5089
Wed           0.7077     1.5361    0.461  0.6452
Thurs         0.1385     1.5361    0.090  0.9282
Fri           2.9231     1.5361    1.903  0.0577 .
Sat           7.1385     1.5361    4.647 4.43e-06 ***
Sun           NA         NA         NA     NA
---
Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

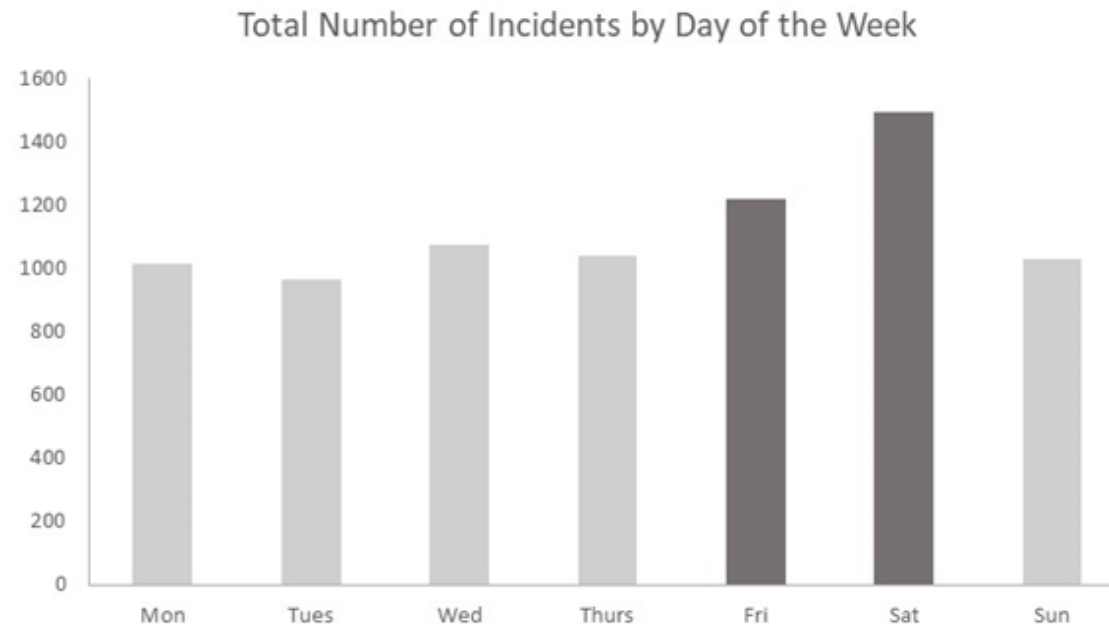
Residual standard error: 8.757 on 448 degrees of freedom
Multiple R-squared:  0.08266,    Adjusted R-squared:  0.07037
F-statistic: 6.728 on 6 and 448 DF,  p-value: 7.752e-07
```

Analysis of Variance Table

```
Response: Count
              Df Sum Sq Mean Sq F value    Pr(>F)
Mon             1    187   187.26    2.4420  0.11883
Tues             1    554   553.60    7.2194  0.00748 **
Wed             1    176   176.49    2.3016  0.12995
Thurs           1    504   504.01    6.5727  0.01068 *
Fri             1     18    18.09    0.2359  0.62739
Sat             1   1656  1656.12   21.5971 4.43e-06 ***
Residuals    448   34354    76.68
---
Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

How is each day of the week different?

Grouping Weekend vs. Weekday



```
Call:
lm(formula = Count ~ ., data = DAY)

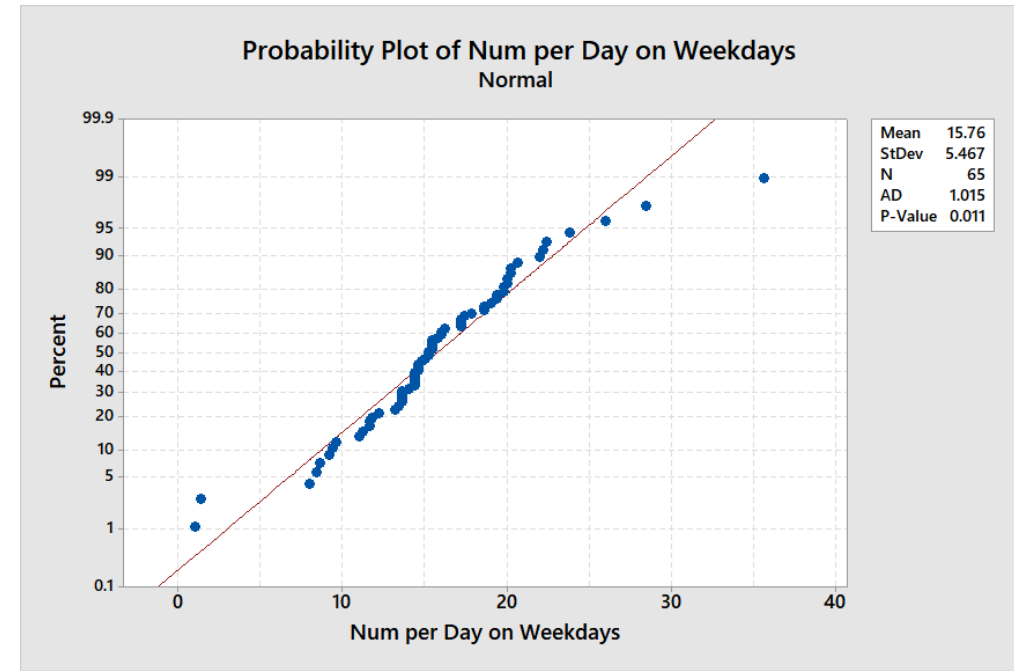
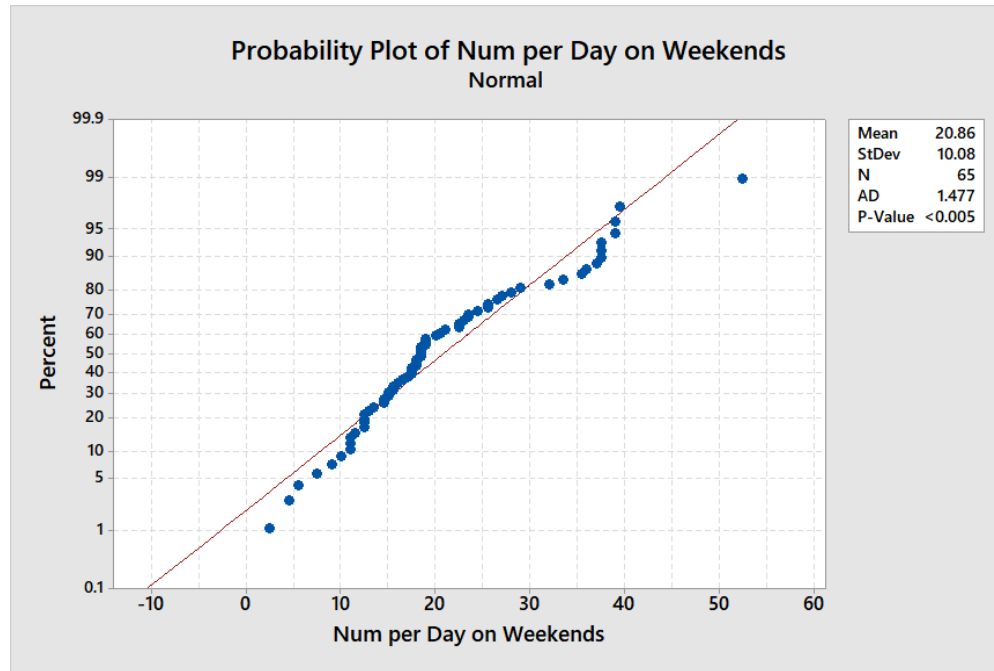
Residuals:
    Min       1Q   Median       3Q      Max
-21.969  -5.254  -0.754   3.354  45.031

Coefficients: (1 not defined because of singularities)
              Estimate Std. Error t value Pr(>|t|)
(Intercept)  15.8308    1.0862   14.575 < 2e-16 ***
Mon          -0.1846    1.5361   -0.120  0.9044
Tues         -1.0154    1.5361   -0.661  0.5089
Wed           0.7077    1.5361    0.461  0.6452
Thurs         0.1385    1.5361    0.090  0.9282
Fri           2.9231    1.5361    1.903  0.0577 .
Sat           7.1385    1.5361    4.647 4.43e-06 ***
Sun           NA         NA         NA     NA
---
Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 8.757 on 448 degrees of freedom
Multiple R-squared:  0.08266,    Adjusted R-squared:  0.07037
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```

Sources: R.

How is each day of the week different?



Approximately Normally Distributed

Sources: Minitab.

How is each day of the week different?

Hypothesis Test

$$H_0: \mu_1 = \mu_2 \text{ vs. } H_1: \mu_1 \neq \mu_2$$

(μ_1 : Average number of incidents on weekends per day,
 μ_2 : Average number of incidents on weekdays per day)

Two-Sample T-Test and CI: Num per Day on Weekends, Num per Day on Weekdays

Two-sample T for Num per Day on Weekends vs Num per Day on Weekdays

	N	Mean	StDev	SE Mean
Num per Day on Weekends	65	20.9	10.1	1.3
Num per Day on Weekdays	65	15.76	5.47	0.68

Difference = μ (Num per Day on Weekends) - μ (Num per Day on Weekdays)

Estimate for difference: 5.10

95% CI for difference: (2.28, 7.92)

T-Test of difference = 0 (vs \neq): T-Value = 3.59 P-Value = 0.001 DF = 98

Reject H_0 ; Statistically significant difference

Multiple Regression: Incident Rate

Source	DF	Adj SS	Adj MS	F-Value	P-Value
Regression	7	155.593	22.2275	15.23	0.000
North	1	3.705	3.7051	2.54	0.112
Weekday	1	12.883	12.8832	8.83	0.003
Away	1	37.231	37.2314	25.52	0.000
North*Weekday	1	0.074	0.0741	0.05	0.822
North*Away	1	0.008	0.0080	0.01	0.941
Weekday*Away	1	1.162	1.1616	0.80	0.373
North*Weekday*Away	1	0.018	0.0180	0.01	0.912
Error	252	367.693	1.4591		
Total	259	523.286			

Model Summary

S	R-sq	R-sq(adj)	R-sq(pred)
1.20793	29.73%	27.78%	25.66%

Coefficients

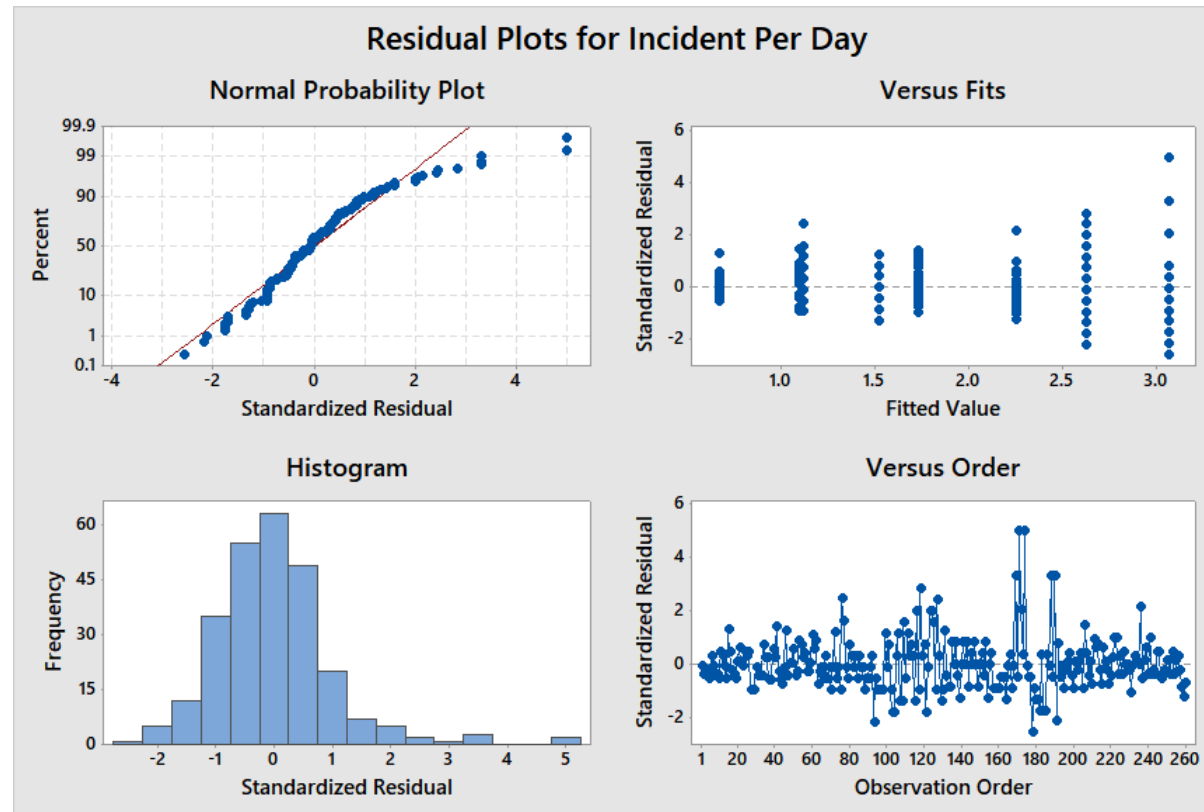
Term	Coef	SE Coef	T-Value	P-Value	VIF
Constant	3.064	0.193	15.84	0.000	
North	-0.436	0.274	-1.59	0.112	3.33
Weekday	-0.813	0.274	-2.97	0.003	3.33
Away	-1.545	0.306	-5.05	0.000	4.00
North*Weekday	-0.087	0.387	-0.23	0.822	5.00
North*Away	0.032	0.433	0.07	0.941	5.33
Weekday*Away	0.386	0.433	0.89	0.373	5.33
North*Weekday*Away	0.068	0.612	0.11	0.912	6.00

Sources: Minitab.

$$\begin{aligned} \text{Incident Per Day} = & 3.064 - \\ & 0.436 * \text{North} - \\ & 0.813 * \text{Weekday} - \\ & 1.545 * \text{Away} - \\ & 0.087 * \text{North} * \text{Weekday} + \\ & 0.032 * \text{North} * \text{Away} + \\ & 0.386 * \text{Weekday} * \text{Away} + \\ & 0.068 * \text{North} * \text{Weekday} * \text{Away} \end{aligned}$$

Multiple Regression: Incident Rate

Incident Per Day = $3.064 - 0.436 \cdot \text{North} - 0.813 \cdot \text{Weekday} - 1.545 \cdot \text{Away} - 0.087 \cdot \text{North} \cdot \text{Weekday} + 0.032 \cdot \text{North} \cdot \text{Away} + 0.386 \cdot \text{Weekday} \cdot \text{Away} + 0.068 \cdot \text{North} \cdot \text{Weekday} \cdot \text{Away}$



Sources: Minitab.

Multiple Regression: Incident Rate

$$\text{Incident Per Day} = 3.064 - 0.436*\text{North} - 0.813*\text{Weekday} - 1.545*\text{Away} - 0.087*\text{North}*\text{Weekday} + 0.032*\text{North}*\text{Away} + 0.386*\text{Weekday}*\text{Away} + 0.068*\text{North}*\text{Weekday}*\text{Away}$$

Data Type	95% Confidence Intervals		95% Prediction Intervals	
	Lower	Upper	Lower	Upper
(North, Weekend, Students present)	2.25	3.01	0.22	5.04
(North, Weekend, Students away)	0.65	1.58	-1.31	3.54
(North, Weekday, Students present)	1.35	2.11	-0.68	4.14
(North, Weekday, Students away)	0.20	1.14	-1.76	3.09
(South, Weekend, Students present)	2.68	3.45	0.65	5.47
(South, Weekend, Students away)	1.06	1.99	-0.91	3.94
(South, Weekday, Students away)	0.63	1.56	-1.33	3.52
(South, Weekday, Students present)	1.87	2.63	-0.16	4.66

Sources: Minitab.

Conclusion

- Overall summary of our findings
 - Statistically significant differences between incidents rate on dorms in North vs South campus; weekend vs weekdays; Dillo vs regular Saturdays; months students are on campus vs months students are away on break
 - Multiple regression on incident rate on campus
- Limitations
- Possible improvements for the future

Questions & Answers

How do different months compare?

Hypothesis Test

$$H_0: \mu_1 = \mu_2 = \dots = \mu_{12} \text{ vs.}$$

$$H_1: \text{at least one } \mu_i \text{ is different}$$

(where each μ_i represents the average number of incidents on different months, January through December)

Reject H_0 ; Statistically significant difference

```
call:
lm(formula = Count ~ Jan + Feb + Mar + Apr + May + Jun + Jul +
    Aug + Sep + Oct + Nov, data = MONTH)
```

```
Residuals:
    Min       1Q   Median       3Q      Max
-57.33 -12.40  -2.50   9.80 110.83
```

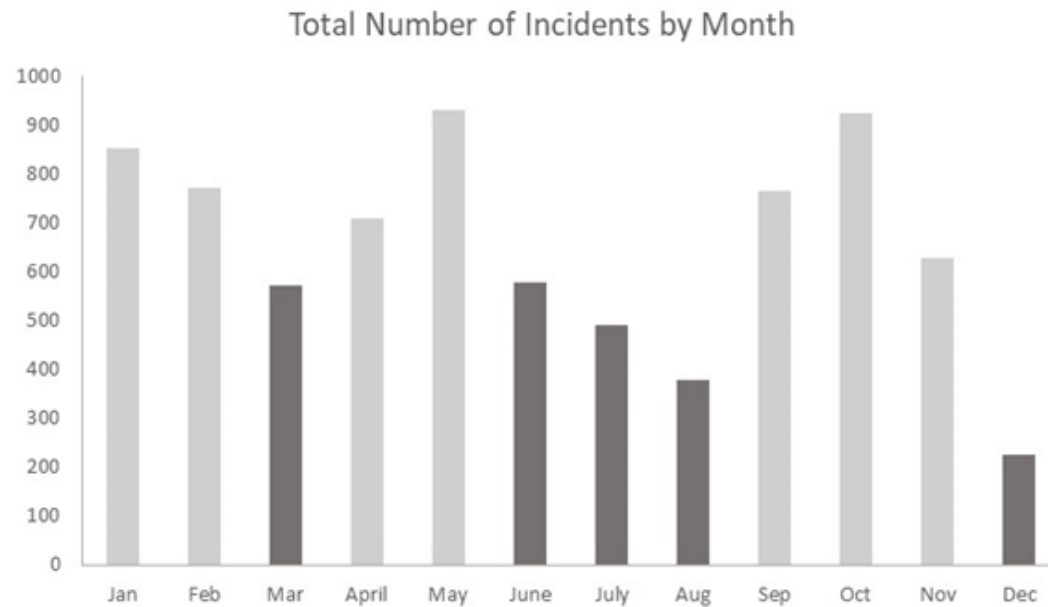
```
Coefficients:
            Estimate Std. Error t value Pr(>|t|)
(Intercept)    45.20     12.38   3.651 0.000598 ***
Jan             96.97     16.76   5.785 3.98e-07 ***
Feb             83.63     16.76   4.989 6.90e-06 ***
Mar             50.30     16.76   3.001 0.004100 **
Apr             72.80     16.76   4.343 6.37e-05 ***
May            110.13     16.76   6.570 2.22e-08 ***
Jun             70.40     17.51   4.021 0.000185 ***
Jul             53.20     17.51   3.039 0.003686 **
Aug             30.60     17.51   1.748 0.086298 .
Sep            108.00     17.51   6.169 9.75e-08 ***
Oct            139.80     17.51   7.985 1.18e-10 ***
Nov             80.60     17.51   4.604 2.63e-05 ***
```

```
---
Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

```
Residual standard error: 27.68 on 53 degrees of freedom
Multiple R-squared:  0.6674,    Adjusted R-squared:  0.5983
F-statistic: 9.667 on 11 and 53 DF,  p-value: 2.847e-09
```

How do different months compare?

Grouping Months Students are present vs. away



```
Call:
lm(formula = Count ~ Jan + Feb + Mar + Apr + May + Jun + Jul +
    Aug + Sep + Oct + Nov, data = MONTH)
```

```
Residuals:
    Min       1Q   Median       3Q      Max
-57.33 -12.40  -2.50   9.80 110.83
```

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Coefficients:
              Estimate Std. Error t value Pr(>|t|)
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F-statistic: 9.667 on 11 and 53 DF, p-value: 2.847e-09
```

Sources: R.

How do different months compare?

Hypothesis Test

$H_0: \mu_1 = \mu_2$ vs. $H_1: \mu_1 \neq \mu_2$ (μ_1 : Average number of incidents in months students are away,
 μ_2 : Average number of incidents in months students are here)

Two-Sample T-Test and CI: Num Per Month on Break, Num Per Month During Classes

Two-sample T for Num Per Month on Break vs Num Per Month During Classes

	N	Mean	StDev	SE Mean
Num Per Month on Break	5	85.84	3.82	1.7
Num Per Month During Cla	5	147.3	14.3	6.4

Difference = μ (Num Per Month on Break) - μ (Num Per Month During Classes)

Estimate for difference: -61.50

95% CI for difference: (-79.92, -43.09)

T-Test of difference = 0 (vs \neq): T-Value = -9.27 P-Value = 0.001 DF = 4

Reject H_0 ; Statistically significant difference