

STATISTICAL METHODS IN RESEARCH

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# **Analysis of How Stress Patterns Define Human Experience and Performance in Dexterous Tasks**

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# Contents

Introduction . . . . .	2
Initial Analysis . . . . .	3
Biographic Data . . . . .	3
Trait Psychometric Data . . . . .	3
State Psychometric Data . . . . .	4
Perinasal Perspiration (Stress) Signal Data . . . . .	4
Performance Data . . . . .	5
Hypothesis Testing . . . . .	7
Analysis of effect of each attribute on Score . . . . .	7
Analysis of effect of each attribute on Time . . . . .	10
Performance Analysis of Suturing Task . . . . .	11
Analysis of Scorers on Task . . . . .	13
Analysis of Number of Sutures made wrt. sex and sessions . . . . .	14
Tai Score Effect on Performance . . . . .	15
Conclusion . . . . .	16
Appendix . . . . .	17
List of Figures . . . . .	17
References . . . . .	21

## INTRODUCTION

The Microsurgery performance data represents the performance of 22 medical students in microsurgery activities. The 22 medical students or subjects in our analysis, participated in a longitudinal study regarding the relationship of sympathetic arousal and skill in learning micro-surgical tasks. The subjects had to pay five visits which we regard as sessions, lasting one hour each, in order to practice micro-surgical cutting and suturing in an inanimate simulator. A pre and post study questionnaire was also given to be completed by the subjects to know a little about their biography and anxiety.

During the main part of each session, the subjects underwent the following treatments:

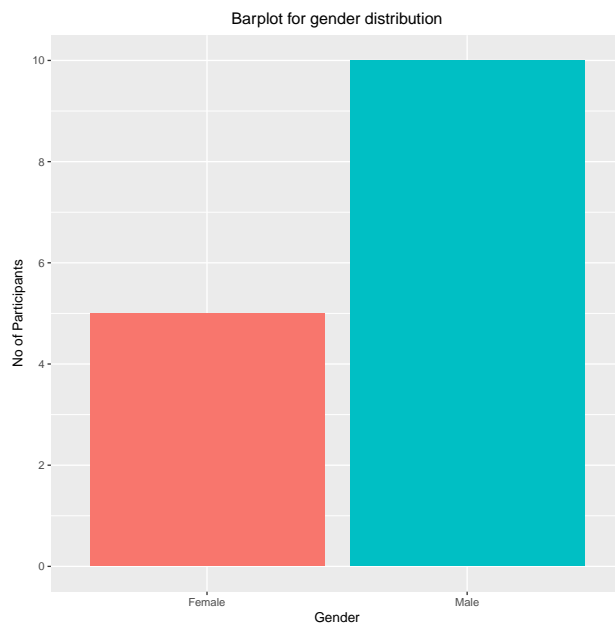
1. Baseline: The subjects were relaxing for 5 min, listening to spa music. They were facially recorded by a thermal and visual camera.
2. Cutting: The subjects had to precision cutting in the inanimate simulator. They were facially recorded by a thermal and visual camera.
3. Suturing: The subjects had to perform suturing in the inanimate simulator. They were facially recorded by a thermal and visual camera.

Explicit accuracy scores per task is provided in the data. Hence, the cutting task has its own accuracy scores and so is the case with the suturing task. The perspiration values are recorded in all time frames for all subjects and sessions. The subjects were asked to fill out a NASA-TLX questionnaire after each task. The NASA-TLX instrument features five subscales measuring different aspects of the subjects' perceptions regarding task difficulty. We perform an analysis with this given data.

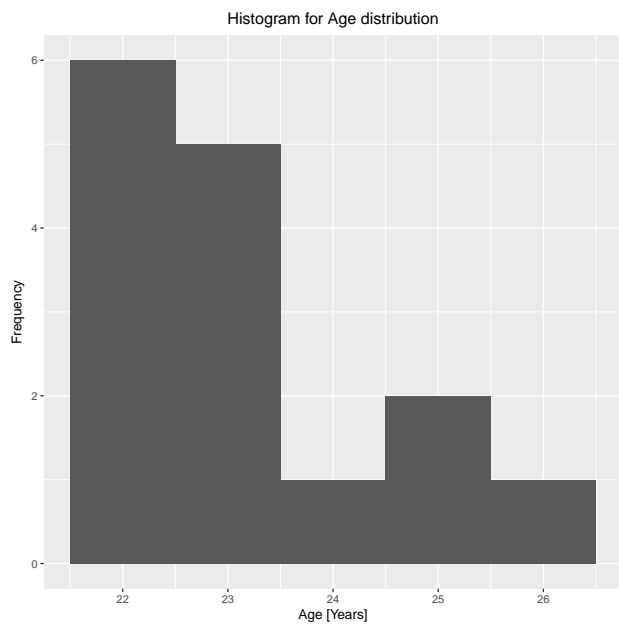
## INITIAL ANALYSIS

### Biographic Data

We draw a bar plot to see how gender defines data and histogram to see whether age has any effect on the data.



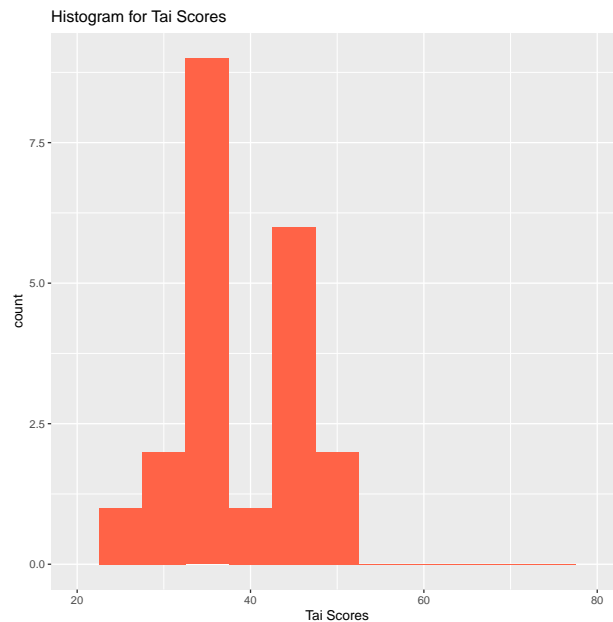
**Figure 1:** Barplot of Gender Distribution



**Figure 2:** Histogram of age distribution

### Trait Psychometric Data

We draw the histogram for Trait Anxiety Inventory(TAI) scores



**Figure 3:** Histogram of Tai Scores

### State Psychometric Data

For each subject draw the bar plots for all the NASA-TLX subscales per task. This will give two figures per subject per subscale, one for suturing and one for cutting, where the evolution of the scores from the initial to the final session will be evident.

### Perinasal Perspiration (Stress) Signal Data

For each session of each subject we draw the perspiration values using black for baseline, green for cutting, and red for suturing.

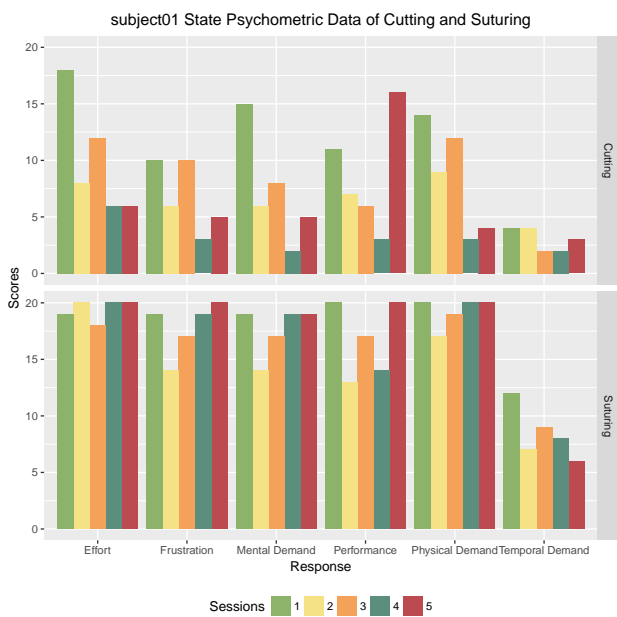


Figure 4: Subject 1

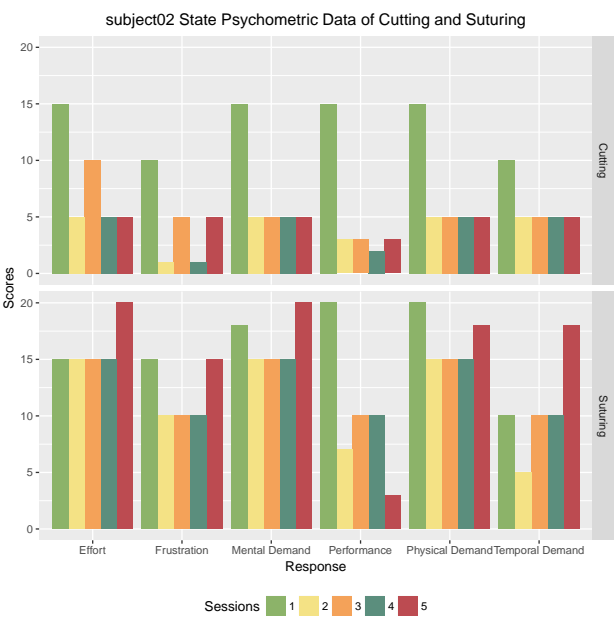


Figure 5: Subject 2

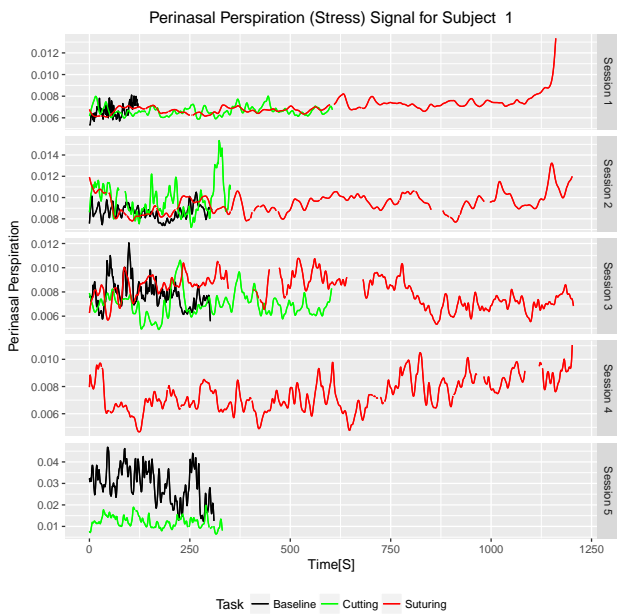


Figure 6: Subject 1

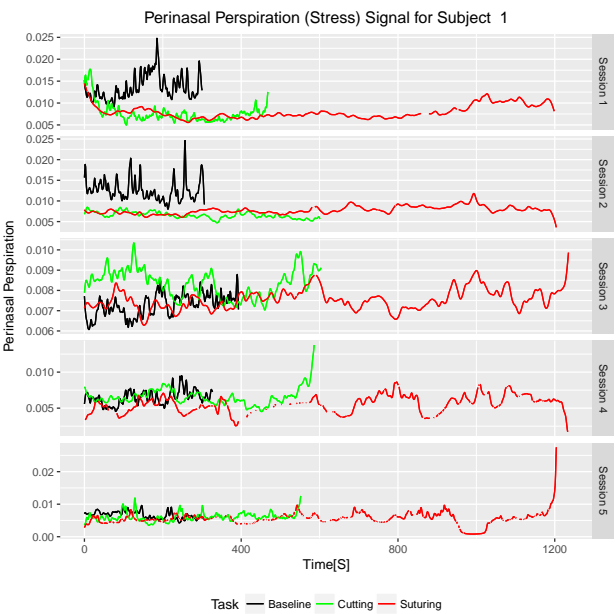
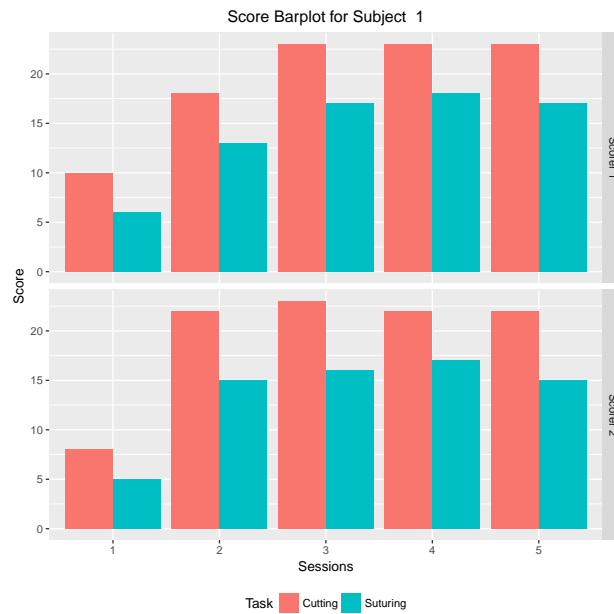
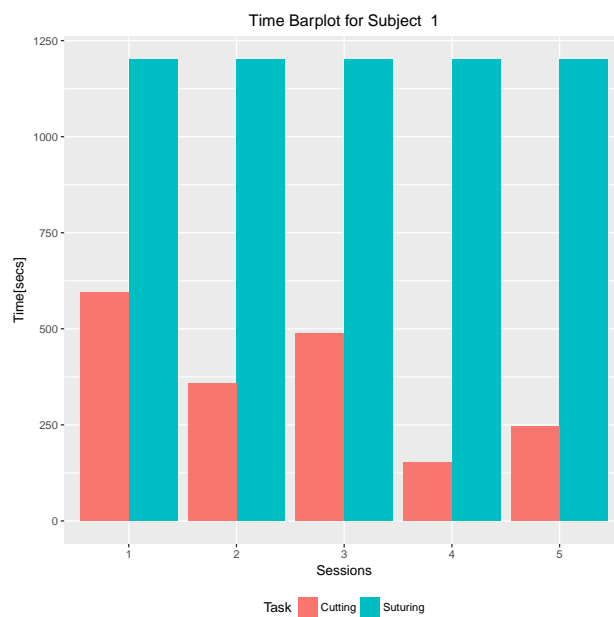


Figure 7: Subject 2

# Performance Data

We draw the accuracy and time bar plots of each subject for each session and each task.

**Figure 8:** Subject 1 Score Barplot**Figure 9:** Subject 1 Time Barplot

## HYPOTHESIS TESTING

We normalize the perspiration values and perform the log of the values for our analysis.

### 1. Analysis of effect of each attribute on Score

#### Hypothesis:

*NullHypothesis*:  $H_0$  = The score obtained does not depend on the demographics of the subject , session , age , year , sex and perspiration.

*AlternateHypothesis*:  $H_1$  = The score obtained depends on the demographics of the subject , session , age , year , sex and perspiration.

#### Approach:Linear Modelling:

Linear modeling gives the relationship between the dependent and independent variables. In our data set we are finding the hypothesis between each attribute such as Age, sex, year and mean perspiration with the scores of scorer.

#### Inference:

The above equation informs us that scores will increase by -34.67 for every one percent increase in mean Perspiration value , and score is directly proportional to age which states that the if older age people are hired the score would have increased



```
Call:
lm(formula = Scores ~ log(Normalised_PP) + Age + Sex + Task +
    Scorer + Session, data = data)

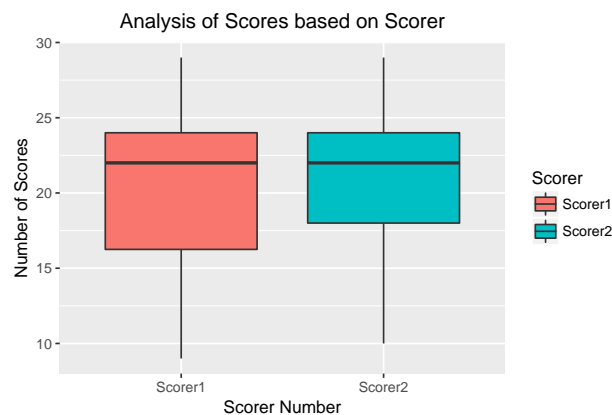
Residuals:
    Min       1Q   Median       3Q      Max
-9.0904 -2.0812  0.1778  2.4703  8.4800

Coefficients:
            Estimate Std. Error t value Pr(>|t|)
(Intercept)   0.43830    5.71336   0.077   0.93891
log(Normalised_PP) -1.13961    0.74582  -1.528   0.12772
Age           0.49486    0.17195   2.878   0.00433 **
SexMale      -2.17630    0.47007  -4.630 0.00000576827 ***
TaskSuturing -0.97517    0.42795  -2.279   0.02349 *
ScorerScorer2  0.02941    0.42648   0.069   0.94507
SessionSession2  4.26300    0.69164   6.164 0.00000000267 ***
SessionSession3  6.38075    0.69130   9.230 < 0.000000000000002 ***
SessionSession4  7.68358    0.70093  10.962 < 0.000000000000002 ***
SessionSession5  8.17553    0.71138  11.492 < 0.000000000000002 ***

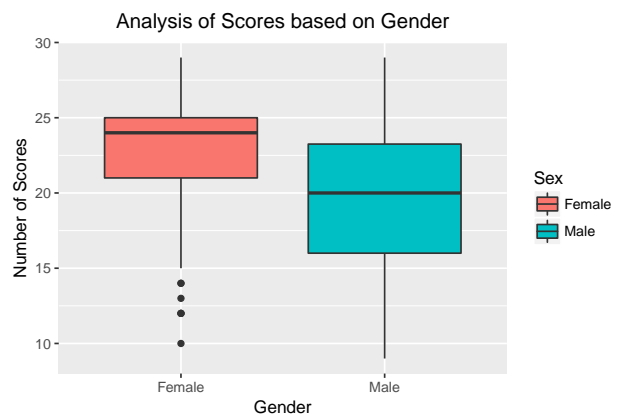
Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

---
Residual standard error: 3.517 on 262 degrees of freedom
(28 observations deleted due to missingness)
Multiple R-squared:  0.4606,    Adjusted R-squared:  0.442
F-statistic: 24.86 on 9 and 262 DF, p-value: < 0.000000000000002
```

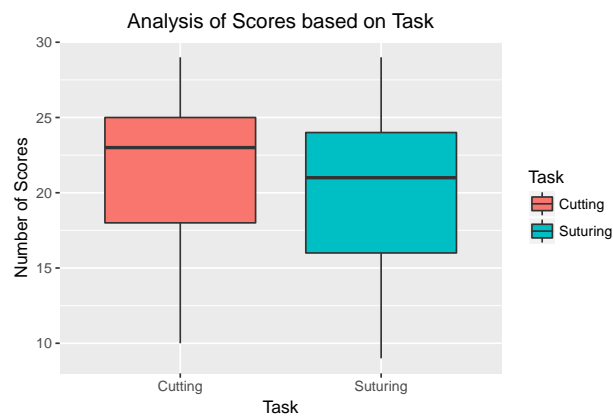
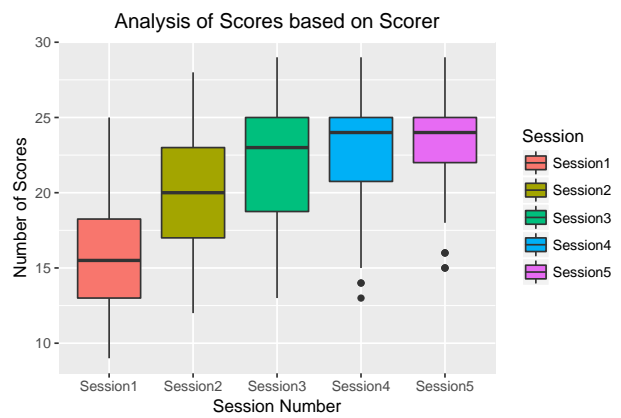
**Figure 10:** Linear model of score vs all other attributes



**Figure 11:** Analysis of Scores based on Score



**Figure 12:** Analysis of Scores based on Gender

**Figure 13:** Analysis of Scores based on Task**Figure 14:** Analysis of Scores based on Session

## 2. Analysis of effect of each attribute on Time

### Hypothesis:

*NullHypothesis* :  $H_0$  = The time taken to do a task is not dependednt of age, session, sex, Perspiration.

*AlternateHypothesis* :  $H_1$  = he time taken to do a task depends on age, session, sex, Perspiration.

### Approach:Linear Modelling:

Linear modeling gives the relationship between the dependent and independent variables. In our data set we are finding the hypothesis between each attribute such as Age, sex, year and mean perspiration with the time taken to do the task.

```
Call:
lm(formula = Time ~ log(Normalised_PP) + Age + Sex + Task + Session,
    data = data)

Residuals:
    Min       1Q   Median       3Q      Max
-340.68  -66.10    4.40   78.19  302.39

Coefficients:
              Estimate Std. Error t value      Pr(>|t|)
(Intercept)    90.273    189.620   0.476      0.634
log(Normalised_PP) -15.595     24.770  -0.630      0.530
Age              7.915      5.711   1.386      0.167
SexMale        18.922     15.612   1.212      0.227
TaskSuturing    872.331     14.213  61.375 < 0.0000000000000002 ***
SessionSession2 -105.645     22.971  -4.599 0.0000065992793776 ***
SessionSession3 -113.626     22.959  -4.949 0.0000013335710345 ***
SessionSession4 -185.969     23.279  -7.989 0.0000000000000429 ***
SessionSession5 -170.059     23.626  -7.198 0.00000000000064042 ***
---
Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 116.8 on 263 degrees of freedom
(28 observations deleted due to missingness)
Multiple R-squared:  0.9365,    Adjusted R-squared:  0.9345
F-statistic: 484.7 on 8 and 263 DF,  p-value: < 0.00000000000000022
```

**Figure 15:** Linear model of Time vs all other attributes

### Inference:

We observe that the means of Time vs Scorer or Gender do not have highly significant difference. Although, Task does have significant difference, we do not take it as a notifiable inference, because the time limits are different for each tasks, with time to complete suturing task being. 20 minutes. Hence, From the summary and the plots we infer that the time taken highly depends on the sessions.

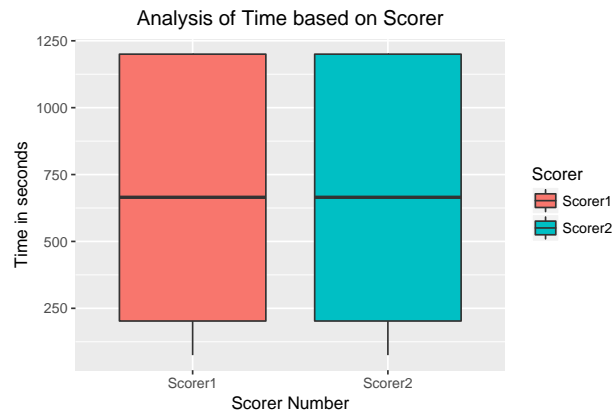


Figure 16: Analysis of Time based on Score

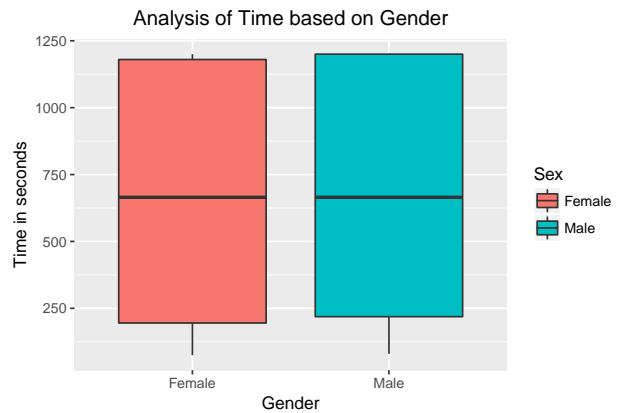


Figure 17: Analysis of Time based on Gender

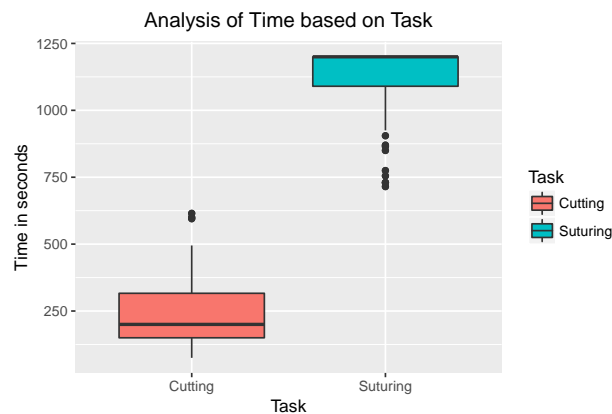


Figure 18: Analysis of Time based on Task

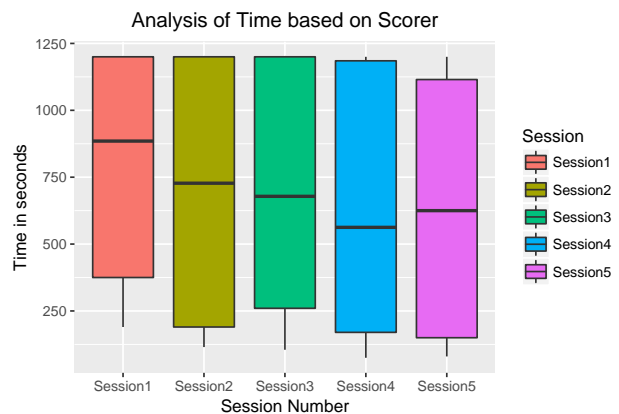


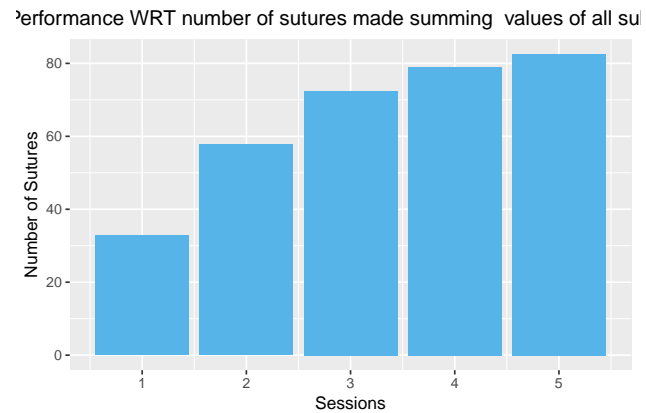
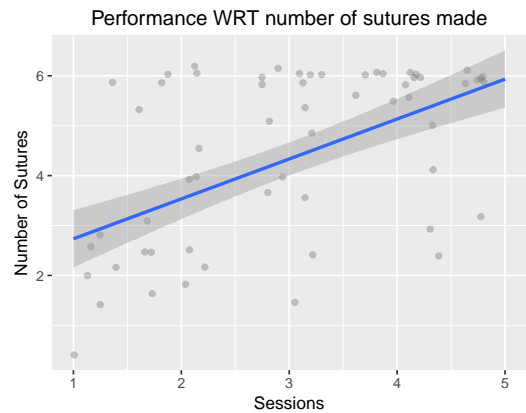
Figure 19: Analysis of Time based on Session

### 3. Performance Analysis of Suturing Task

Approach: Linear Model:

From the figures, we understand that the number of sutures increases with each session.

To summarize it over all the subjects, we draw the bar plot with values of all subjects summed under each session, which gives us an understanding that with each session, the performance



**Figure 20:** Performance WRT number of sutures made **Figure 21:** Performance WRT number of sutures summed across all subjects

```
Call:
lm(formula = Sutures ~ Sex * session)

Residuals:
    Min       1Q   Median       3Q      Max
-2.95  -0.70   0.30   0.75   2.80

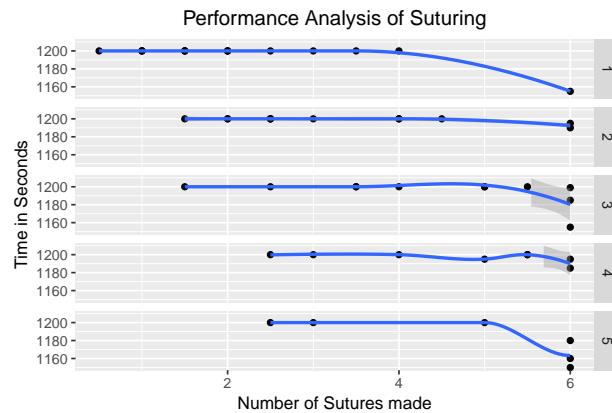
Coefficients:
              Estimate Std. Error t value Pr(>|t|)
(Intercept)    3.2000    0.5732   5.582 0.00000499 ***
SexMale        -1.5000    0.7021  -2.136 0.036409 *
sessionSession2  2.1000    0.8107   2.590 0.011823 *
sessionSession3  2.4000    0.8107   2.960 0.004284 **
sessionSession4  2.5000    0.8107   3.084 0.002999 **
sessionSession5  2.8000    0.8107   3.454 0.000978 ***
SexMale:sessionSession2 -0.6500    0.9929  -0.655 0.515003
SexMale:sessionSession3  0.3500    0.9929   0.353 0.725601
SexMale:sessionSession4  0.8500    0.9929   0.856 0.395098
SexMale:sessionSession5  0.7500    0.9929   0.755 0.452759
---
Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 1.282 on 65 degrees of freedom
Multiple R-squared:  0.5661,    Adjusted R-squared:  0.5061
F-statistic: 9.425 on 9 and 65 DF,  p-value: 0.00000005144
```

**Figure 22:** Analysis of Linear Model

increases across all subjects.

When creating the linear model, and performing the analysis, we observe that the number of sutures is highly dependent on sessions. Also, from the Performance analysis with respect to time plot (Figure 23), we infer that as the time decreases, the subjects are able to make more number of sutures and as number of session increases, the performance gets better. **Inference:** The number of sutures made increases with each session and takes less time, i.e. the subjects are



**Figure 23:** Performance Analysis of Suturing over Time

performing well.

#### 4. Analysis of Scorers on Task:

##### Hypothesis:

*Null Hypothesis:*  $H_0$  = The mean of scores is same for both the Scorers

*Alternate Hypothesis:*  $H_1$  = The mean of scores is different for both the Scorers

##### Approach: Wilcoxon Test:

**Cutting :** When performed Wilcoxon test, p-value is greater than 0.05, which applies the means have not changed

**Suturing:** When performed Wilcoxon test, p-value is less than 0.05, which states that the means of the scorers is different.

##### Inference:

Scorer has an effect for Suturing and Cutting

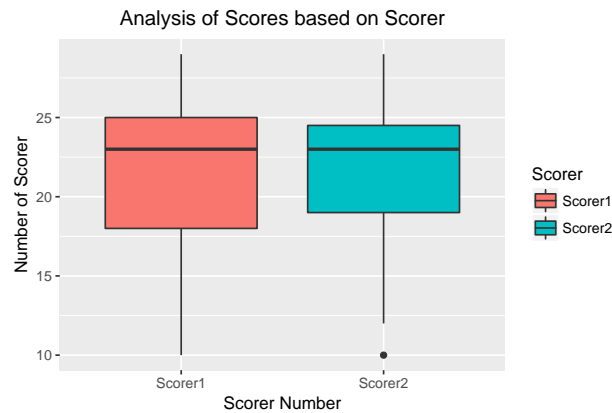


Figure 24: Cutting Scores

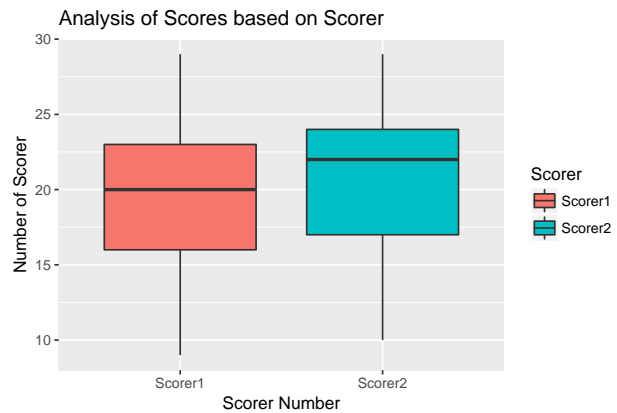


Figure 25: Suturing Scores

## 5. Analysis of Number of Sutures made with respect to sex and sessions:

### Hypothesis:

*NullHypothesis*:  $H_0$  = The number of sutures made is not significant on sex of the subject

*AlternateHypothesis*:  $H_1$  = The number of sutures made is significant on sex of the subject

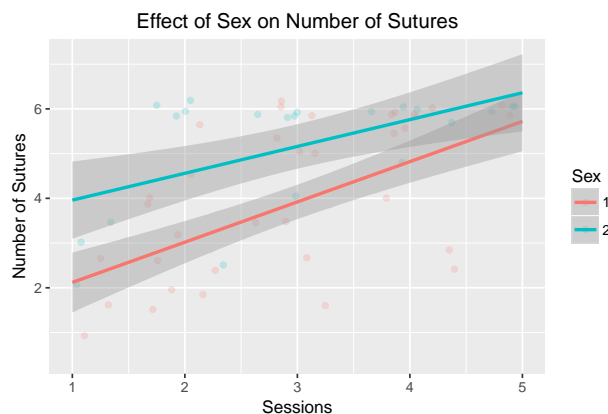


Figure 26: Interaction plot of Number of Sutures made wrt to Sex and Session

When performing the analysis for effect of Sutures on interaction of Sex and Sessions, we observe that, the p-value is  $6.44e-11$  which is way less than 0.05.

Also, from the interaction plot, we understand that the number of sutures made increases with the number of sessions and females make more number of sutures than males in average.

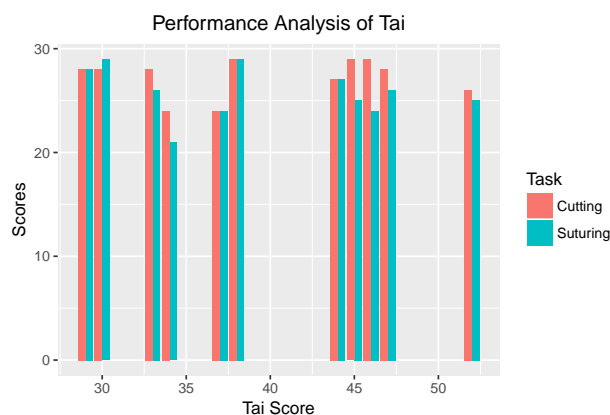
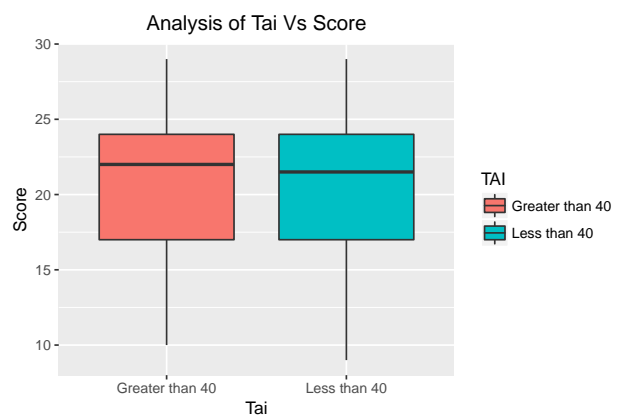
**Inference:**

Sex has an effect on Number of Sutures made and females made more number of Sutures in 20 minutes and the number os sutures increases with each session, i.e subject's performance gets better with each session.

**6. Analysis of Performance With Respect to TAI****Hypothesis:**

*NullHypothesis:  $H_0$*  = The performance score does not depend on tai score

*AlternateHypothesis:  $H_1$*  = With increase in tai score, the performance score decreases

**Approach:T Test:****Figure 27:** Analysis of Tai Vs Scores**Figure 28:** Analysis of Tai Vs Scores

Given, In the data, that Tai score above 40 means the subject is highly anxious. When performed T test, between all the values below or equal to 40 and above 40, we observe that the p-value is greater than 0.05, which indicates we accept the null hypothesis.

In addition, from the plots we can infer that the scores are pretty much the same, for both, above and below 40 Tai



**Inference:**

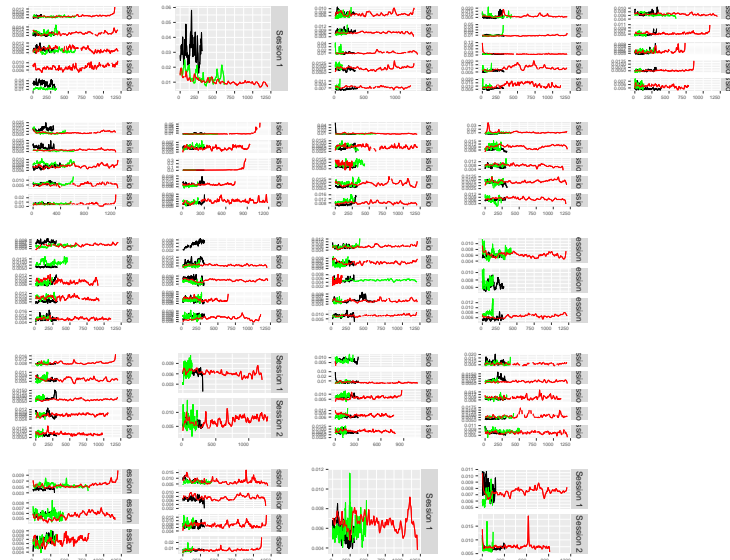
With this, we infer that the in general, performance does not depend on how anxious the subject is.

**CONCLUSION**

## List of Figures

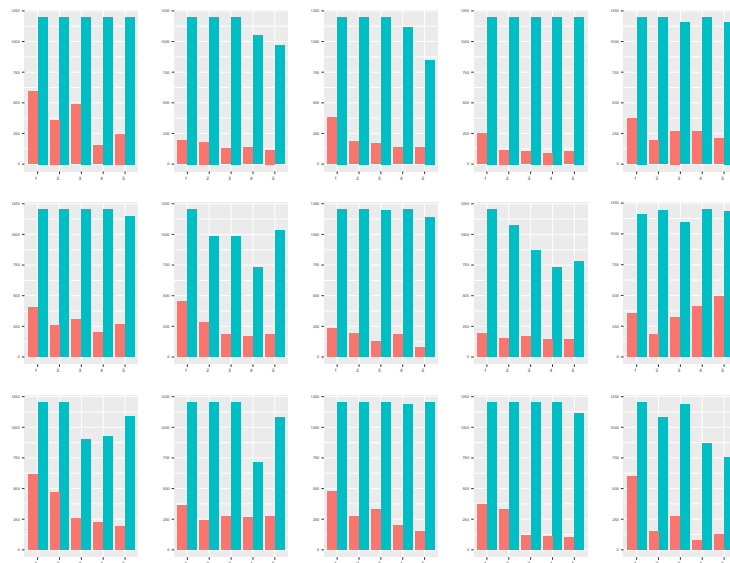
**Figure 29: State Psychometric Data of all Subjects**

## Page 17 of 21



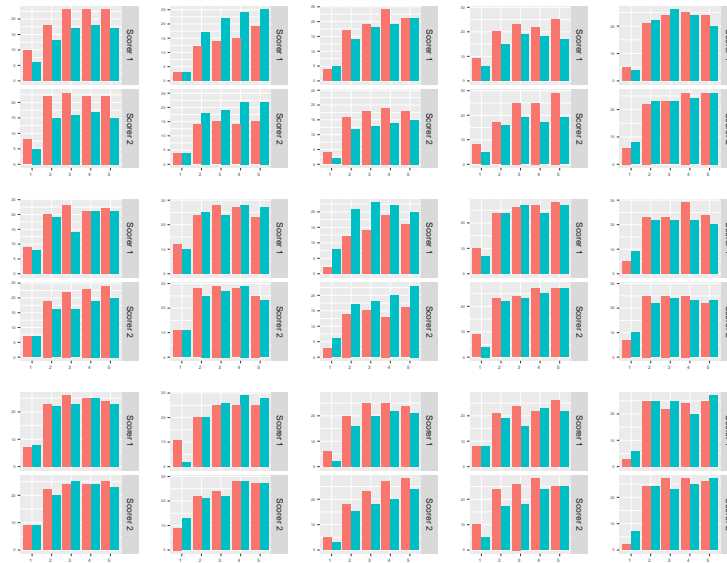
**Figure 30:** Perinasal Perspiration (Stress) Signal Data of all subjects

### 3. Suturing Time Performance of all Subjects



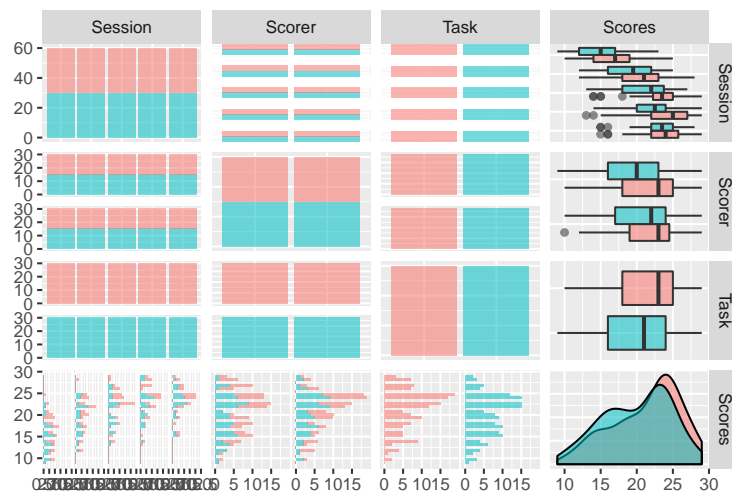
**Figure 31:** Suturing Time Performance of all Subjects

#### 4.Accuracy of Scores of all subjects



**Figure 32:** Accuracy of Scores of all subjects

#### 5.Matrix Visualization of Plots of Data based on Task



**Figure 33:** Accuracy of Scores of all subjects

## 6. Matrix Visualization of Plots of Cutting Data based on scorer

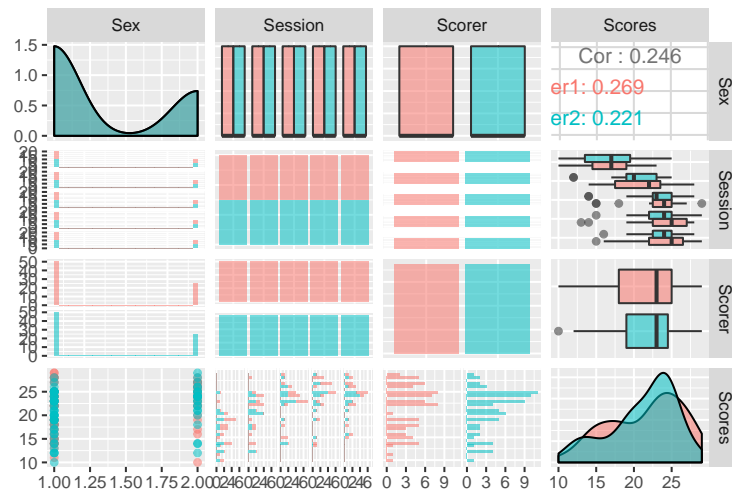


Figure 34: Accuracy of Scores of all subjects

## 7. Matrix Visualization of Plots of Suturing Data based on scorer

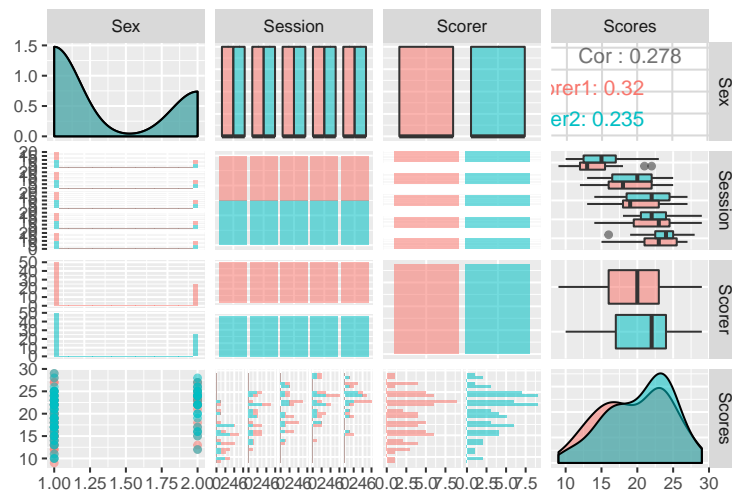
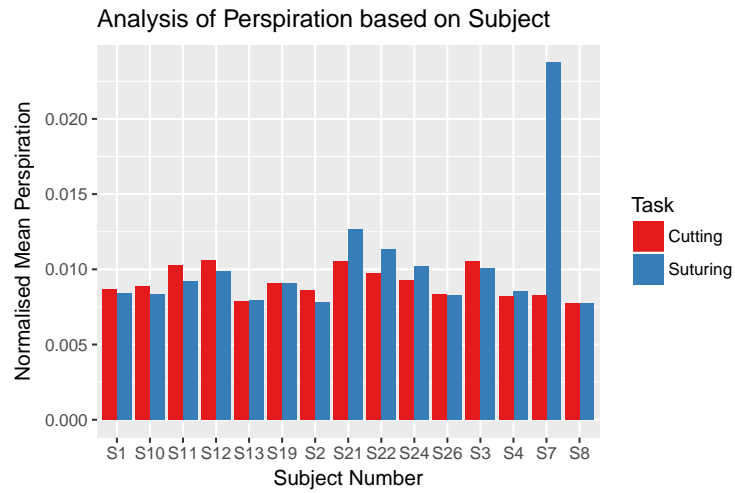


Figure 35: Accuracy of Scores of all subjects

## 8. Analysis of Mean Perspiration Based on Subject



**Figure 36:** Accuracy of Mean Perspiration of all subjects

## REFERENCES