# Speech Emotion Perception in Depression

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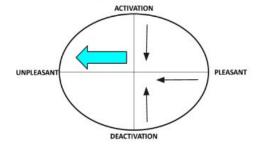
## **Problem Statement & Hypothesis**

#### Objective:

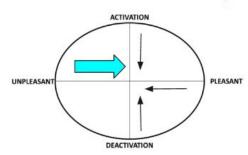
In this cross-sectional study, participants would rate the emotion of the speaker from the audio files presented to them. We then would analyze and infer the effect of self reported depression on emotion perception of speech and whether current mood or demographic details(personal and familial history) seem to play a role in this case.

#### Hypothesis:

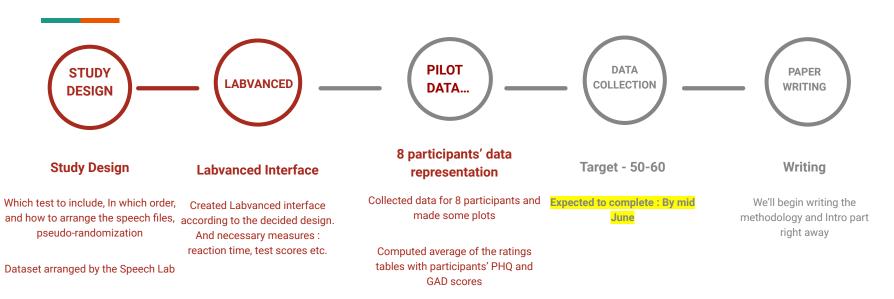
#### Beck's Depression Theory ?



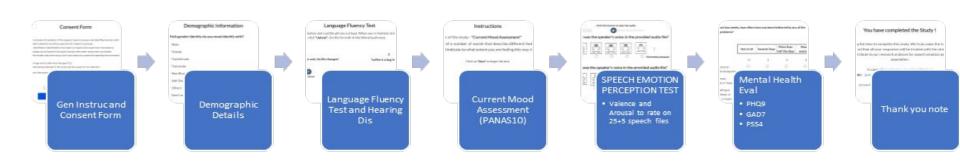
#### **Emotional Context Insensitivity Theory?**



#### **Timeline**



## **Study Design - Labvanced Interface**



#### **Dataset**

#### Dataset

Pseudo-randomization of speech files among 4 sets.

Total samples - 100

Anger - 25

Happy - 25

Neutral - 25

Sad - 25

Set - A: 25

+5 = **30** 

Set - B: 25

+5 = **30** 

Set - C:25

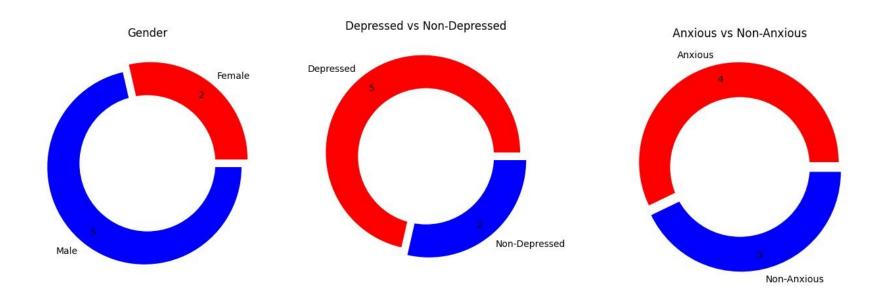
+5 = **30** 

Set - D:25

**+**5 **= 30** 

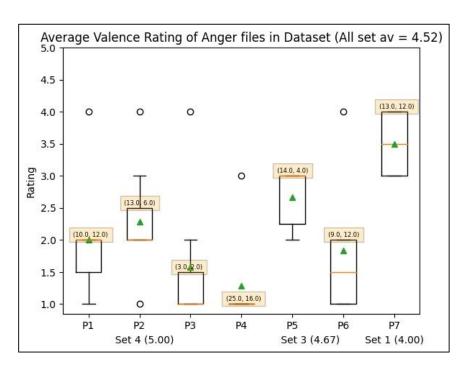
- Almost equal number of files from each emotion in each set
- Ensuring that no two files of the similar rating come together in the set
- 5 files are repeated in end of each set ~ Intra rater Reliability

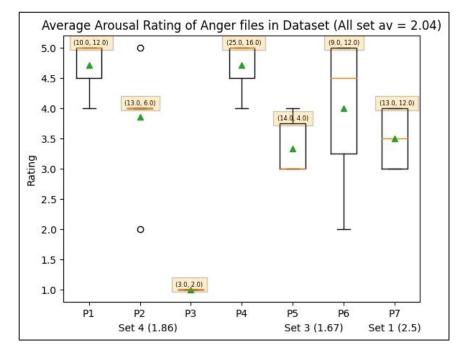
## **Data Collection : Profile of Participants**



## **Data Representation (Anger)**

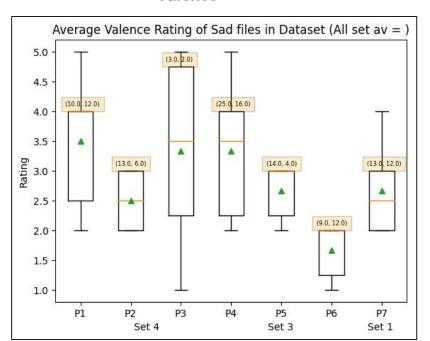
**Valence** 

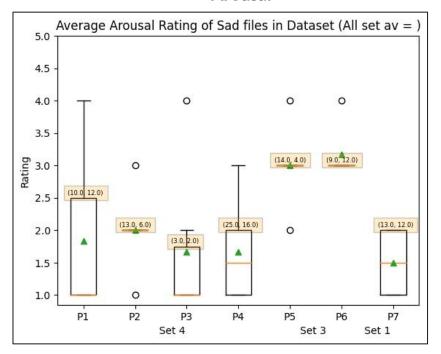




## **Data Representation (Sad)**

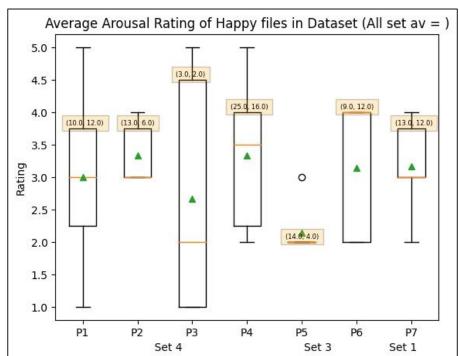


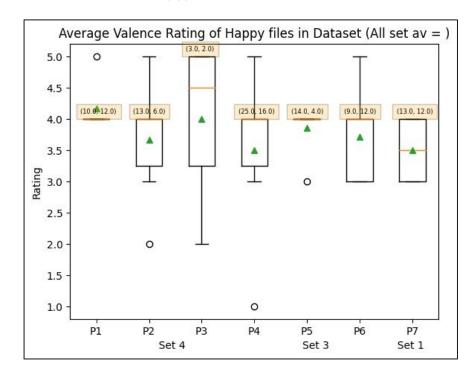




## **Data Representation (Happy)**

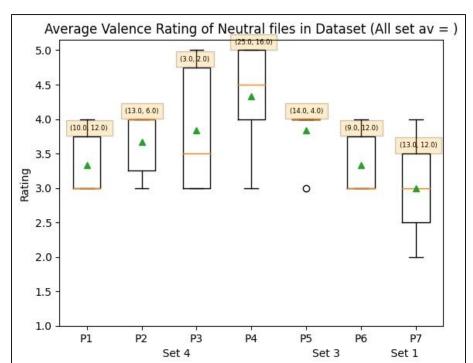


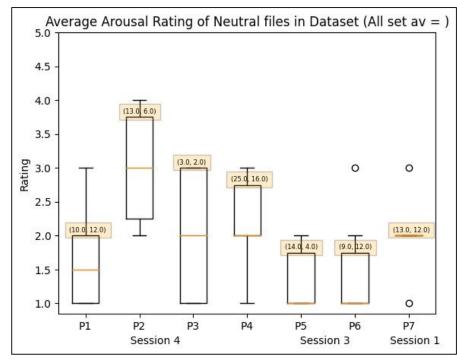




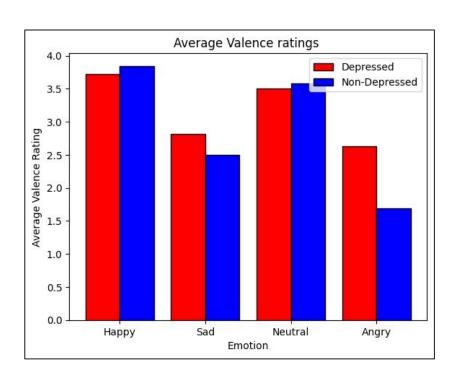
## **Data Representation (Neutral)**

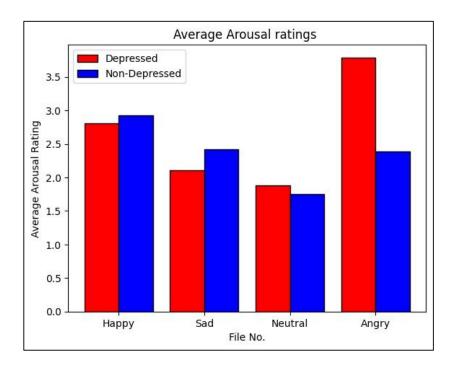






## Average Ratings of participants for each emotion





## **Data for all participants**

Emotion   P1   P2   P3   P4   P5   P6   P7   P4   P5   P6   P7   P7	+	<b>+</b>	+	<b>!</b>	<b>+</b>	<b>+</b>	+	<del></del>
happy   4.16666666666666   3.66666666666666   4.0   3.5   3.857142857142857142857142857144   3.5   sad   3.5   2.5   3.333333333333333333333333333333333	Emotion	P1	P2	P3	P4	P5	P6	P7
	happy   sad   neutral	4.166666666666667   3.5   3.33333333333333333	3.6666666666666665 2.5 3.6666666666666666666	4.0   3.3333333333333333   3.8333333333333333	3.5 3.33333333333333333 4.33333333333333	3.857142857142857 2.6666666666666665 3.83333333333333333	3.7142857142857144 1.66666666666666667 3.3333333333333333333	3.5     2.666666666666665     3.0

## Data after categorisation (Depressed / Non Depressed)

Valence Arousal

Emotion	Depressed	Non Depressed
Нарру	   3.7192982456140347	+   3.8461538461538463
Sad	2.814814814814815	3.6401336401336403   2.5
Neutral	3.5087719298245617	,   3.58333333333333333
Angry	2.6315789473684212	1.6923076923076923

	·	
Emotion	Depressed	Non Depressed
Нарру	2.807017543859649	2.923076923076923
Sad	2.111111111111111	2.41666666666666
Neutral	1.8771929824561402	1.75
Angry	3.789473684210526	2.3846153846153846

## Data after categorisation (Anxious / Non-Anxious)

Valence Arousal

Emotion	Anxious	Non Anxious
Нарру	+   3.6842105263157894	+   3.8461538461538463
Sad	2.583333333333333	2.791666666666666
Neutral	3.3684210526315788	3.791666666666666
Angry	2.289473684210526	2.269230769230769

Emotion	Anxious	Non Anxious
Нарру	+   3.1578947368421053	2.538461538461538
Sad	2.13888888888888	2.41666666666666
Neutral	1.8157894736842106	1.91666666666666
Angry	4.105263157894737	2.846153846153846

## **Data in csv files**

#### Left to do

#### Data Collection

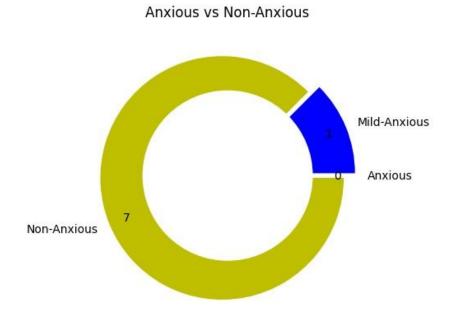
- 1) Analysis on complete data
  - a) Statistical Tests (ANOVA etc.)
  - b) Inferential Statistics

Paper Writing

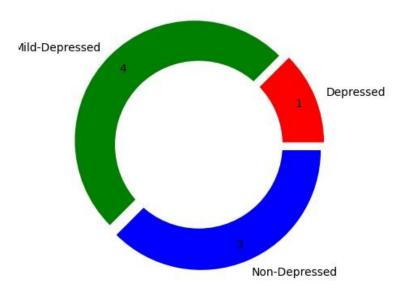
## Set - 3 Data

Performed by: 8 Participants

## **Profile of the Participants**

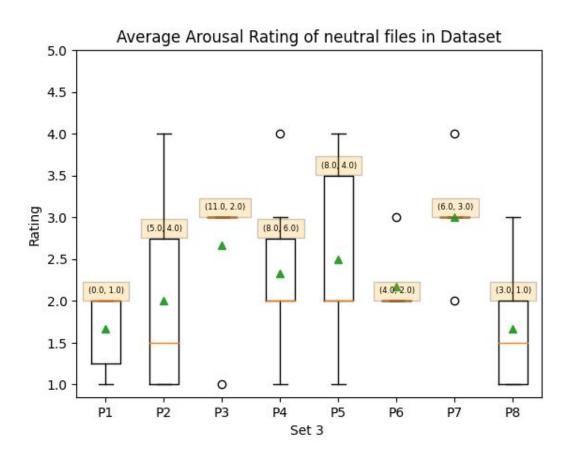


#### Depressed vs Non-Depressed



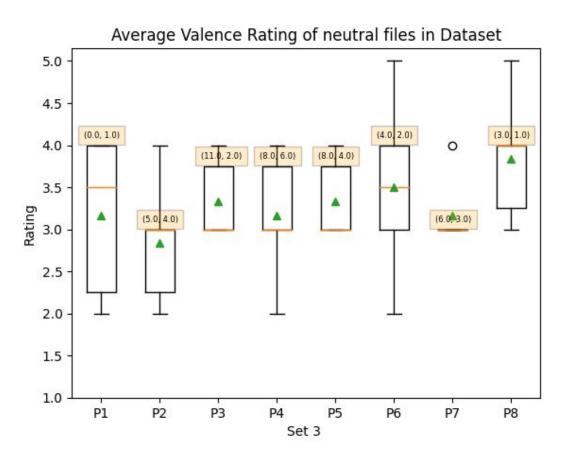
#### **Neutral (Arousal)**

Avg from dataset: 2



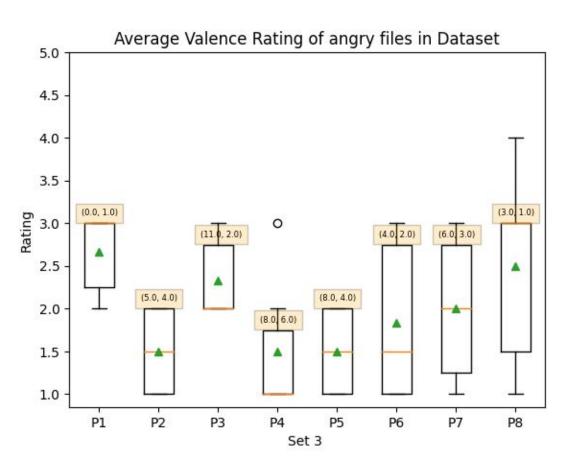
#### Neutral (Valence)

Avg from dataset: 3



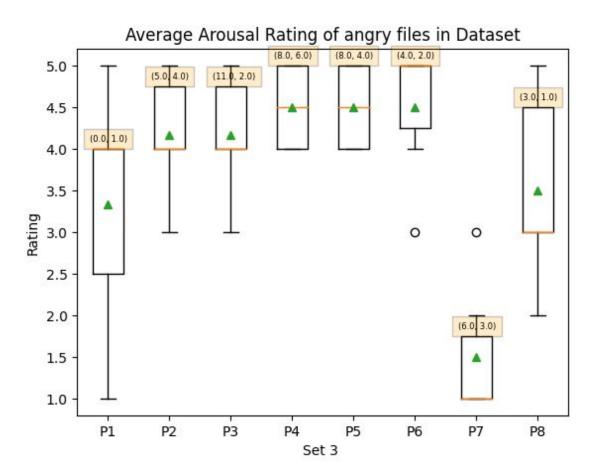
## Angry (Valence)

Avg from dataset: 1.33



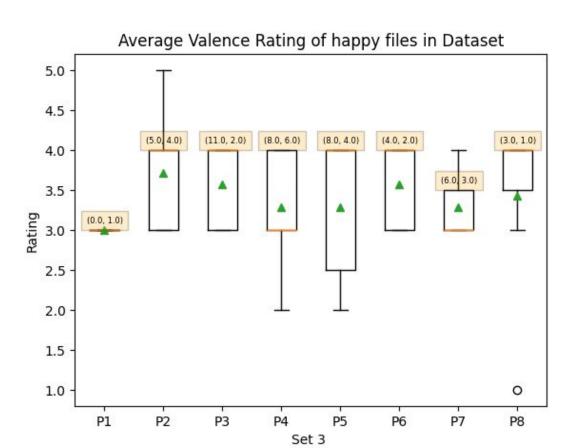
## **Angry (Arousal)**

Avg from dataset: 3.5



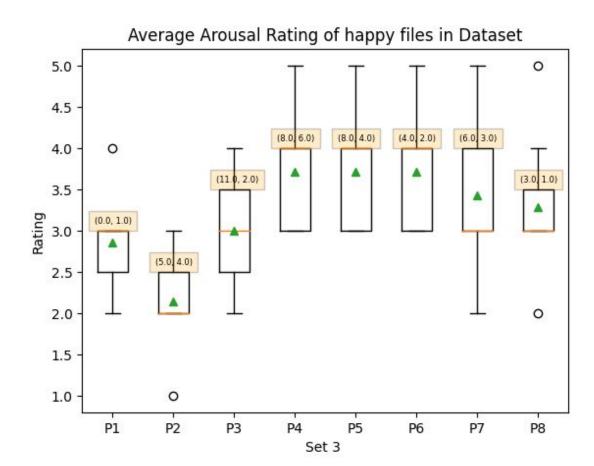
## Happy (Valence)

Avg from dataset: 4



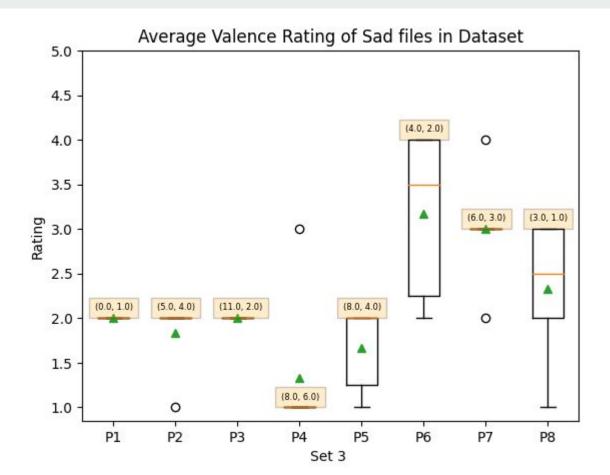
## Happy (Arousal)

Avg from dataset: 3



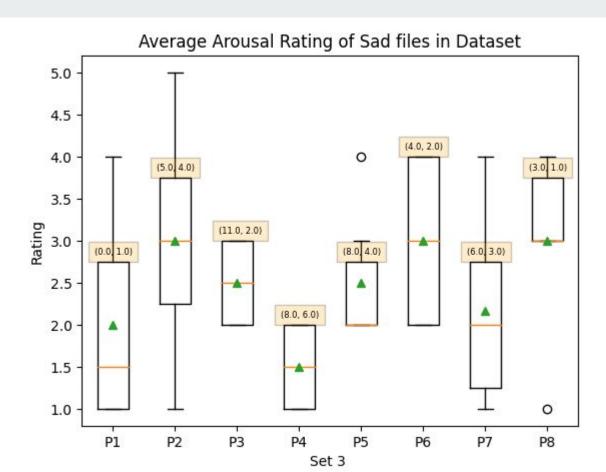
#### Sad (Valence)

Avg from dataset: 2.1



#### Sad (Arousal)

Avg from dataset: 1.833



#### **DATA in CSV format**

Raw data obtained from the Labvanced

The CSV file of compiled data

## **Participants**

#### 43 Participants

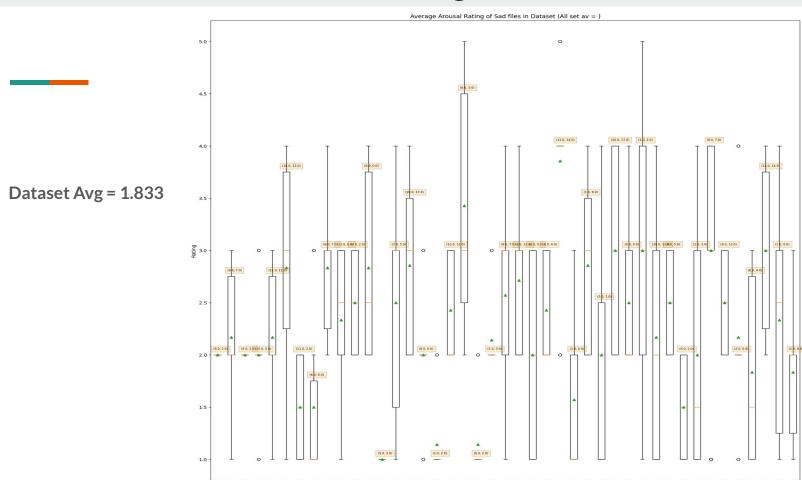
Set A - 14

Set B - 15

Set C - 8

Sec D - 6

## SAD labelled files (Arousal ratings)



P1 P2 P3 P4 P5 P6 P7 P8 P9 P10 P11 P12 P13 P14 P15 P16 P17 P18 P9 P10 P11 P12 P13 P14 P15 P16 P17 P18 P19 P20 P21 P22 P23 P24 P25 P26 P27 P28 P29 P30 P31 P32 P33 P34 P35 P36 P37 P38 P39 P40 P41 P42 P43

## SAD labelled files (Valence ratings)

Avg from dataset: 2.1

## Angry labelled files (Valence ratings)

Avg from dataset: 1.33

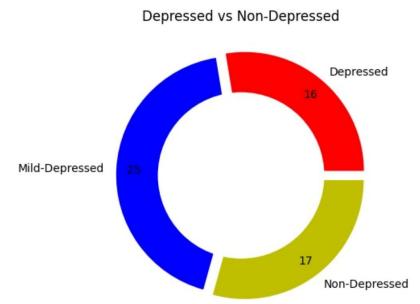
## **Angry labelled files (Arousal ratings)**

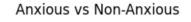
Avg from dataset: 3.5

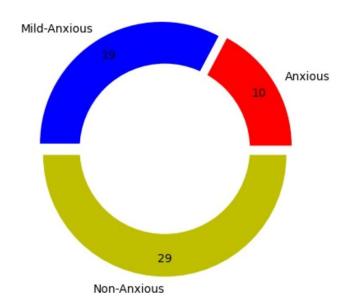


## **Profile of Participants**

**Total Participants = 58** 







## **Arousal Ratings**

#### **Dataset**

	Set 1	Set 2	Set 3	Set 4
Нарру	3	3.16	3	3
Sad	1.83	1.43	1.833	2.33
Angry	3.5	3.83	3.5	4.42
Neutral	2	2.5	2	2.5

#### **Data Collected**

Emotion	Session 1	Session 2	Session 3	Session 4
	+		+	+
Нарру	3.63	3.22	3.21	3.33
Sad	2.13	2.34	2.55	2.31
Angry	2.98	3.72	3.81	4.07
Neutral	2.17	2.24	2.24	2.51

#### **Cumulative avg**

3.04

1.85

3.81

2.25

#### **Cumulative avg**

3.34

2.33

3.64

## **Valence Ratings**

#### **Dataset**

	Set 1	Set 2	Set 3	Set 4
Нарру	4	4.16	4	4.167
Sad	2.16	2.42	2.1	2
Angry	2	1.67	1.33	1
Neutral	3	3	3	3.5

#### **Cumulative avg**

4.08 2.17 1.5 3.125

#### **Data Collected**

Emotion	Session 1	Session 2	Session 3	Session 4
	+ <del>-</del>		   3.46	+ 
Нарру	3.89	4.0	3.46	3.63
Sad	2.42	2.73	2.08	2.91
Angry	2.99	2.19	1.77	2.05
Neutral	2.69	3.19	3.29	3.64

#### **Cumulative avg**

3.74

2.53

2.25

## **Set - 1** (Self Reported Depression Categorization)

Valence (Data Collected)

**Arousal (Data Collected)** 

Emotion   Depressed   Mild - Depressed   Non	
Happy   3.77   3.88	4.25
Sad   2.5   2.38	2.42
Angry   3.0   3.02	2.83
Neutral   2.6   2.73	2.71

Emotion	Depressed	Mild - Depressed	Non - Depressed
	<del> </del>	<del>!</del>	<del>!</del>
Нарру	3.33	3.58	4.58
Sad	2.17	2.1	2.17
Angry	2.97	2.98	3.0
Neutral	2.17	2.18	2.14

#### From the Dataset

Set 1
4
2.16
2
3

<b>Cumulative avg</b>
3.04
1.85
3.81
2.25

## **Set - 1** (Self Reported Anxiety Categorization)

Valence (Data Collected)

**Arousal (Data Collected)** 

+   Emotion	Anxiety	+   Mild - Anxiety	   Non - Anxiety
Нарру	3.42	3.94	3.98
Sad	2.58	2.39	2.4
Angry	3.25	2.89	3.0
Neutral	2.64	2.57	2.8
+	+	+	++

+	Anxiety		+
Emotion		Mild - Anxiety	Non - Anxiety
Happy	3.33	3.89	3.5
Sad	2.5	2.22	1.95
Angry	3.42	3.19	2.67
Neutral	2.21	2.26	2.08

#### Cumulative avg 4.08

2.17

2.1*7* 1.5

3.125

#### **Cumulative avg**

3.04 1.85

3.81

5.0.

## **Set - 2 (Self Reported Depression Categorization)**

Valence (Data Collected)

**Arousal (Data Collected)** 

+	·	<b>+</b>	++
Emotion	Depressed	Mild - Depressed	Non - Depressed
+	4.44 2.38 1.89 2.83	4.08   3.1   2.25   3.39	3.69     2.55     2.28     3.17

+   Emotion	+   Depressed	   Mild - Depressed	   Non - Depressed
Нарру	3.44	3.28	3.06
Sad	3.05	2.38	1.95
Angry	4.06	3.61	3.67
Neutral	2.61	2.39	1.92
+			<b></b>

#### **Cumulative avg**

4.08

2.17

1.5

3.125

#### **Cumulative avg**

3.04

1.85

3.81

## **Set - 2 (Self Reported Anxiety Categorization)**

Valence (Data Collected)

**Arousal (Data Collected)** 

+   Emotion +	   Anxiety	   Mild - Anxiety	+   Non - Anxiety   
Happy	4.38	4.22	3.73
Sad	2.54	3.05	2.71
Angry	1.88	2.33	2.29
Neutral	2.92	3.39	3.25
+	+	+	++

Emotion	Anxiety	Mild - Anxiety	Non - Anxiety
Happy	3.5	2.83	3.23
Sad	2.96	2.95	1.8
Angry	4.17	3.22	3.69
Neutral	2.46	2.94	1.88

#### Cumulative avg 4.08

2.17

1.5

3.125

#### **Cumulative avg**

3.04 1.85

3.81

## **Set - 3 (Self Reported Depression Categorization)**

Valence (Data Collected)

Arousal (Data Collected)

+	Depressed		+
Emotion		Mild - Depressed	Non - Depressed
Happy	3.71	3.48	3.25
Sad	1.67	1.97	2.54
Angry	1.83	1.56	2.04
Neutral	2.94	3.39	3.42

Emotion	Depressed	Mild - Depressed	Non - Depressed
 Нарру	3.29	3.14	3.25
Sad	2.28	2.67	2.58
Angry	3.72	3.81	3.88
Neutral	2.61	2.36	1.79
	·	<b></b>	<b></b>

#### **Cumulative avg**

4.08

2.17

1.5

3.125

#### **Cumulative avg**

3.04

1.85

3.81

## **Set - 3 (Self Reported Anxiety Categorization)**

Valence (Data Collected)

Arousal (Data Collected)

+	<del> </del>	·	·
Emotion +	Anxiety	Mild - Anxiety   	Non - Anxiety
Нарру	3.86	3.25	3.52
Sad	1.33	1.79	2.31
Angry	1.67	1.29	2.02
Neutral	2.67	3.17	3.44
+	+	<del> </del>	·+

++   Emotion	Anxiety	+   Mild - Anxiety	   Non - Anxiety
Happy	3.43	3.36	3.11
Sad	2.0	2.54	2.62
Angry	3.83	4.0	3.71
Neutral	2.83	2.25	2.17

#### Cumulative avg

4.08

2.17

1.5

3.125

#### **Cumulative avg**

3.04 1.85

3.81

## **Set - 4 (Self Reported Depression Categorization)**

Valence (Data Collected)

**Arousal (Data Collected)** 

Emotion	Depressed	   Mild - Depressed	++   Non - Depressed
Happy Sad Angry Neutral	3.7   2.67   2.11   3.6	3.53   3.17   1.97   3.8	3.67     2.9     2.06     3.53

Emotion	Depressed	Mild - Depressed	Non - Depressed
Нарру	3.17	3.33	3.5
Sad	2.23	2.03	2.67
Angry	3.77	4.4	4.03
Neutral	2.23	2.5	2.8

#### **Cumulative avg**

4.08

2.17

1.5

3.125

#### **Cumulative avg**

3.04 1.85

3.81

## **Set - 4 (Self Reported Anxiety Categorization)**

Valence (Data Collected)

**Arousal (Data Collected)** 

+			+
Emotion	Anxiety	Mild - Anxiety	Non - Anxiety
+			+
Happy Sad Angry Neutral	3.5	3.67	3.67
	2.67	2.83	3.11
	2.29	1.95	2.02
	3.5	3.61	3.75

   Emotion	Anxiety	   Mild - Anxiety	H   Non - Anxiety
Нарру	3.11	3.44	3.33
Sad	2.28	2.11	2.53
Angry	3.9	4.14	4.07
Neutral	2.39	2.33	2.75
		<del> </del>	<del> </del>

#### **Cumulative avg**

4.08 2.17

1.5

3.125

#### **Cumulative avg**

3.04 1.85

3.81

