

**DATATHON**  
Powered by UCL

# CUSTOMER SENTIMENT ANALYSIS

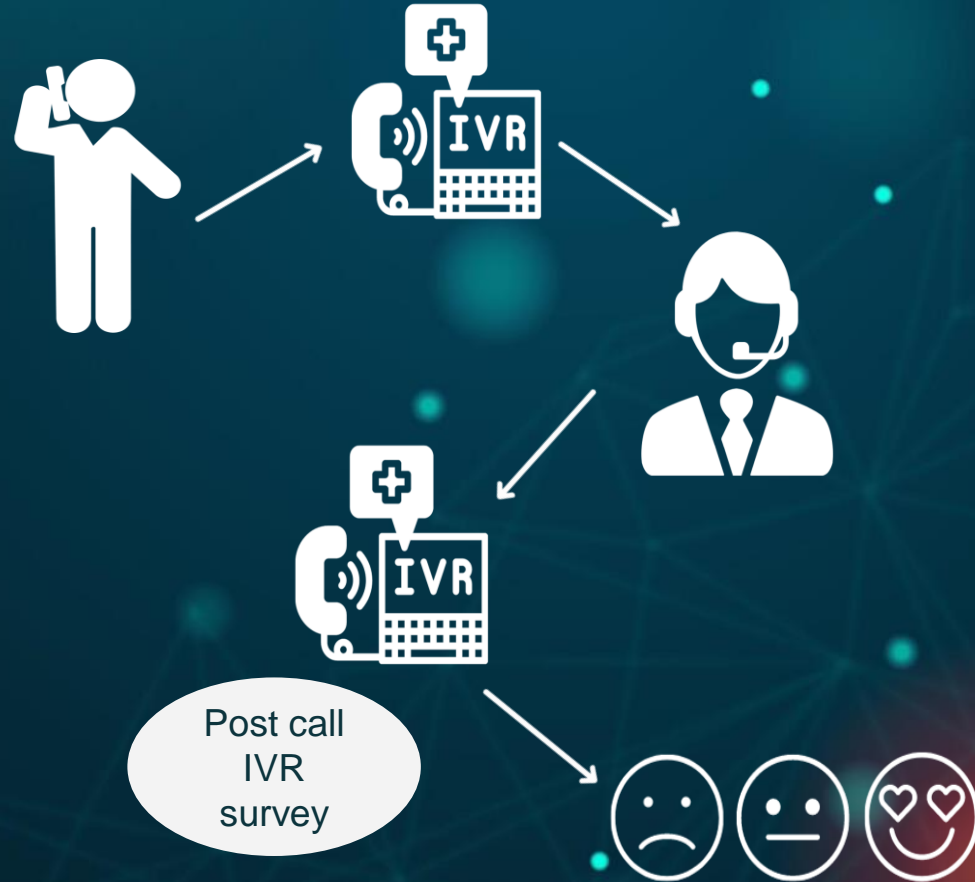
AI-Based Speech Emotion Recognition



**CODANIANS**



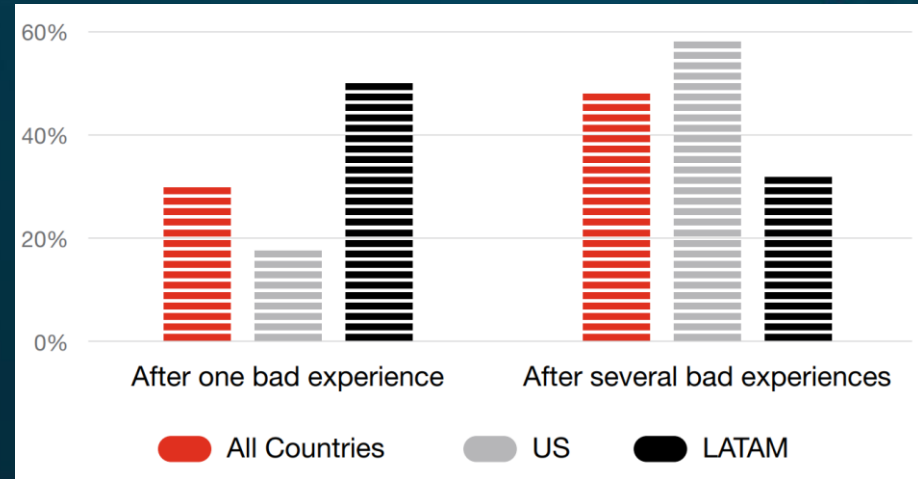
**“Companies worldwide spend  
>\$1.3 Trillion  
for  
256 Billion  
customer care calls per annum”  
~ Analytics Insights**



## Post Call IVR Survey

- Easy to Execute
  - Low Cost
  - Easy to Get Agent Level Scores
- 
- Low Response Rates
  - Low Volumes of Qualitative Feedback
  - Fail to Depict the Sentiments of Customers
  - Difficult to Assess True Feedback

## Leaving Ratio of Customers



# How to Do it?



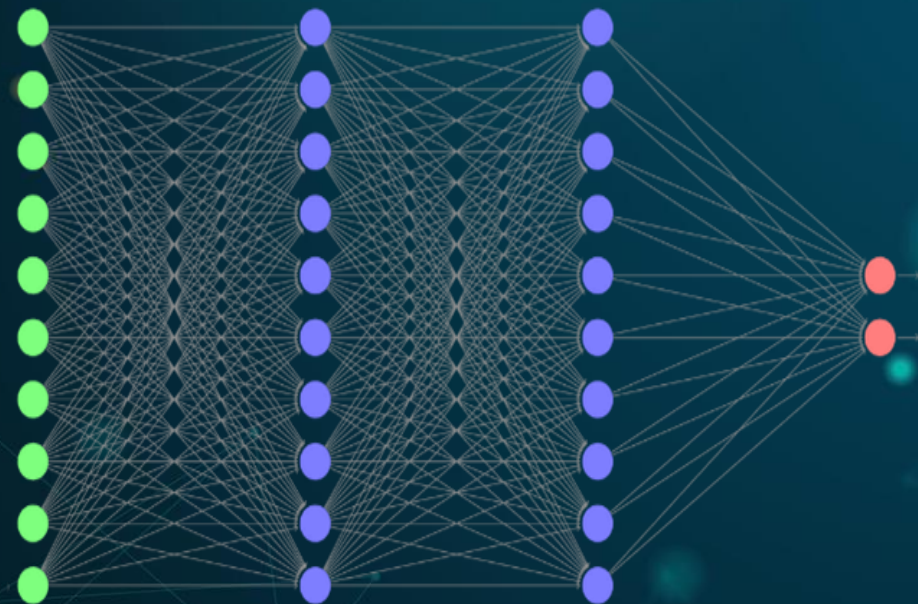
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Input Layers

Hidden Layers

Hidden Layers



Speech Signal



Deep Neural Network



Emotions



CODANIANS



# BENEFITS



Cost Effectiveness



Customer Satisfaction



Brand Reputation



Increased ROI



Customer Rentention



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# METHODOLOGY



## Data Sets

RAVDESS, SAVEE,  
CREMA-D, TESS, Speech  
Accent Archive

01



## Features Extraction

Zero Crossing Rate,  
Chroma\_stft, MFCC,  
RMS value,  
MelSpectrogram

03



## Model Evaluation

Confusion Matrix,  
Classification Report

05



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02

## Exploratory Data Analysis

Drawing Insights from Data



04

## Model Training

Convolutional Neural  
Network



06

## Emotion Prediction

Predicted Emotions from  
Speech Accent Archive  
Dataset







# DATA SETS



Ryerson Audio-Visual Database  
of Emotional Speech and Song



Toronto Emotional  
Speech Set



Surrey Audio-Visual  
Expressed Emotion



Crowd-sourced Emotional  
Multimodal Actors Dataset



Speech Accent Archive

# DATA AUGMENTATION

The process to augment or enhance the data with some modification in the given data



# FEATURE EXTRACTION

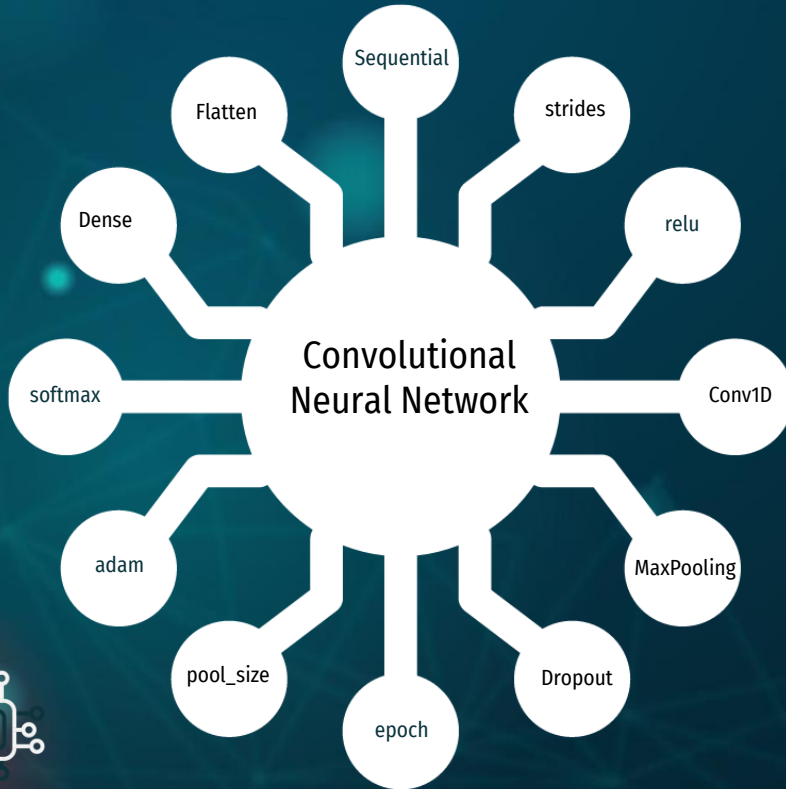
The process of retrieving information from audio signal is called features extraction.

Chroma Short Time  
Fourier Transform

MFCC (Mel-Frequency Cepstral Coefficients)



# MODEL TRAINING



Model: "sequential\_7"

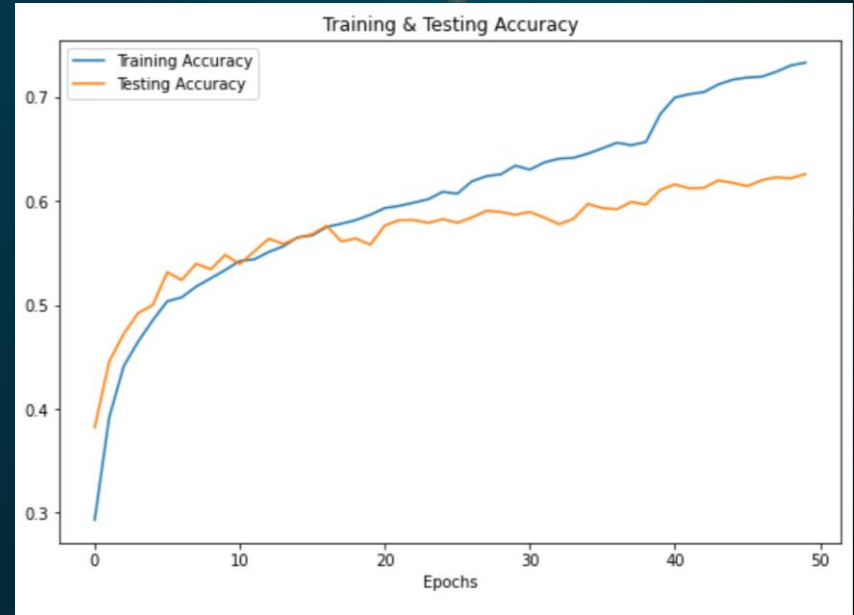
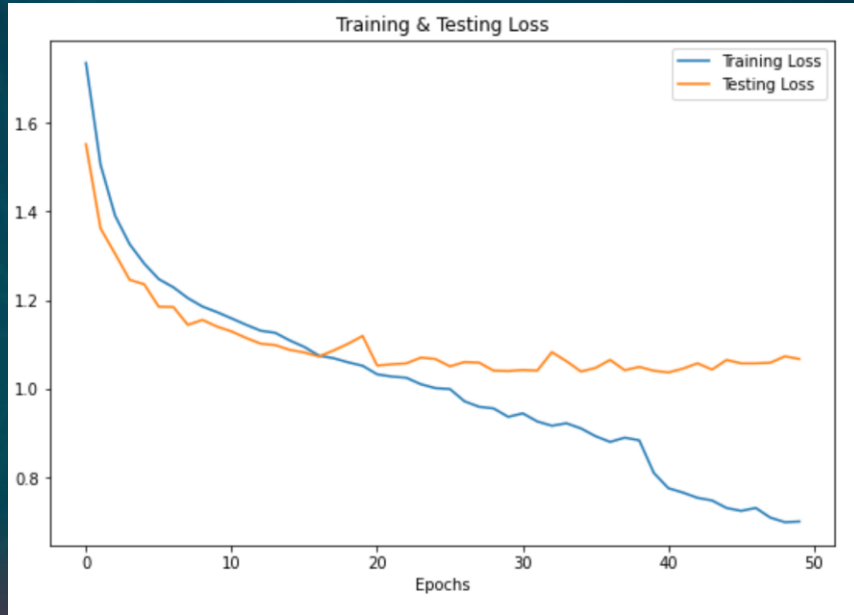
Layer (type)	Output Shape	Param #
conv1d_35 (Conv1D)	(None, 162, 256)	1536
max_pooling1d_35 (MaxPooling1D)	(None, 81, 256)	0
conv1d_36 (Conv1D)	(None, 81, 256)	327936
max_pooling1d_36 (MaxPooling1D)	(None, 41, 256)	0
conv1d_37 (Conv1D)	(None, 41, 128)	163968
max_pooling1d_37 (MaxPooling1D)	(None, 21, 128)	0
dropout_21 (Dropout)	(None, 21, 128)	0
conv1d_38 (Conv1D)	(None, 21, 128)	82048
max_pooling1d_38 (MaxPooling1D)	(None, 11, 128)	0
dropout_22 (Dropout)	(None, 11, 128)	0
conv1d_39 (Conv1D)	(None, 11, 64)	41024
max_pooling1d_39 (MaxPooling1D)	(None, 6, 64)	0
flatten_7 (Flatten)	(None, 384)	0
dense_14 (Dense)	(None, 32)	12320
dropout_23 (Dropout)	(None, 32)	0
dense_15 (Dense)	(None, 8)	264

Total params: 629,096  
Trainable params: 629,096  
Non-trainable params: 0



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# LOSS AND ACCURACY

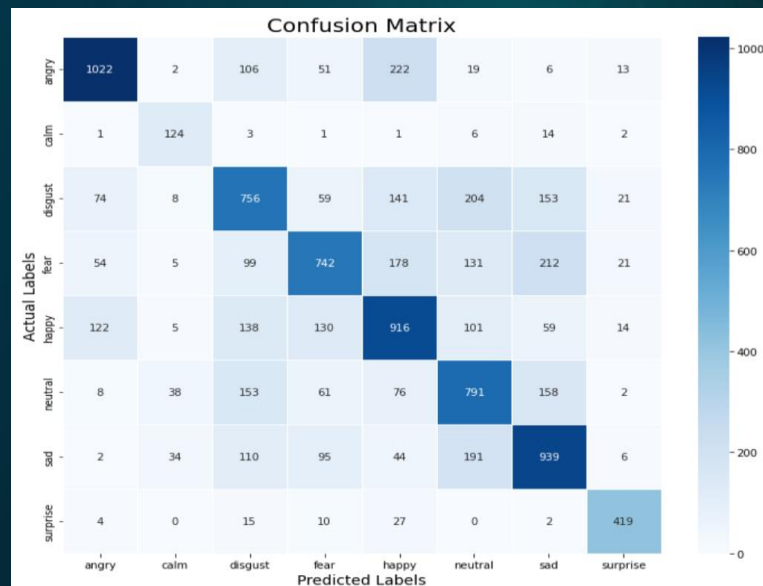


# MODEL EVALUATION

## Classification Report

	precision	recall	f1-score	support
angry	0.79	0.71	0.75	1441
calm	0.57	0.82	0.67	152
disgust	0.55	0.53	0.54	1416
fear	0.65	0.51	0.57	1442
happy	0.57	0.62	0.59	1485
neutral	0.55	0.61	0.58	1287
sad	0.61	0.66	0.63	1421
surprise	0.84	0.88	0.86	477
accuracy			0.63	9121
macro avg	0.64	0.67	0.65	9121
weighted avg	0.63	0.63	0.63	9121

## Confusion Matrix





# PROTOTYPE


Navigation

- Home
- Prediction

Choose an Audio file

Drag and drop files here  
Limit: 200MB per file

Browse files



Speech Emotion Recognition

Shows Customers Emotions!

www.codania.tech

Navigation

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- Prediction

Choose an Audio file

Drag and drop files here  
Limit: 200MB per file

Browse files

arabic54.wav  
3.21MB

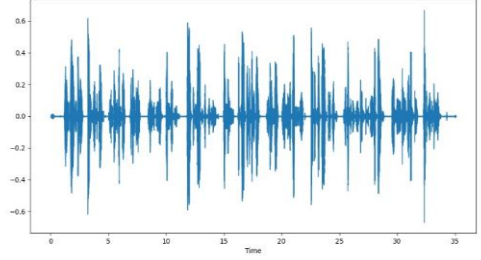
www.codania.tech

Audio

0.00 / 0.15

Waveplot

Waveplot for Audio



Time

Navigation

- Home
- Prediction

Choose an Audio file

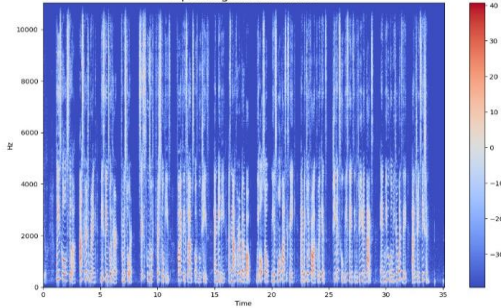
Drag and drop files here  
Limit: 200MB per file

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3.21MB

Spectrogram

Spectrogram for Audio



Time

Navigation

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Choose an Audio file

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Browse files

arabic54.wav  
3.21MB



Time

Extracted Voice Features

Table

Emotion Prediction

Predicted Labels	Labels
0	disgust
	arabic54

# FUTURE PROSPECTS

Combined with Conversational AI, SER is a perfect model for Voice Chat bots

## CONVESATIONAL AI CHATBOTS



## TARGETED MARKETING

Customized offers based on customers' speech emotions



## SER

Speech  
Emotion  
Recognition



Model can be trained on local languages in Pakistan

## SER IN LOCAL LANGUAGES



## SER IN HEALTH CARE

In psychiatry wards Emotion Recognition can be used to assess patients mental status