



# Human/Animal Emotion Recognition Using ECG & ML Techniques

Group 22

# Team



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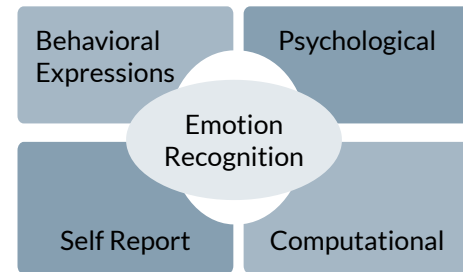
# Introduction

## Emotion

- Way to communicate beyond words
- Complex processes that involve feelings, body movement, etc

## Emotion Recognition

- In order to understand behavior and make decisions
- Affective computing
  - Entertainment, marketing, healthcare, e-learning etc..., .
  - Interaction with computers more productive and interactive.
  - Provide emotional intelligence to computing systems.



Emotion recognition methods

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# Literature Review

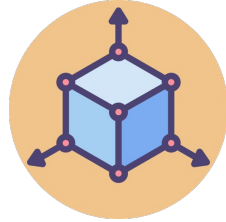
# Theoretical Background



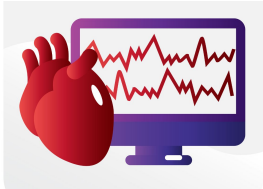
Human Emotions



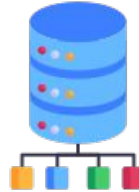
Animal Emotions



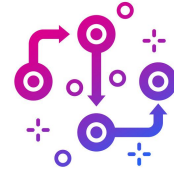
Emotional Modeling



Electrocardiography



ECG Data Sets



Methodology

# Human Emotions

Study	Adopted Emotions	Emotion Elicited Method	No.of Subjects	Accuracy
Rattanyu and Mizukawa (2011)	anger, fear, sadness, joy, digest, neutral	Picture	12	61.44%
Jeritta et al. (2012)	neutral, happiness, sadness, fear, surprise, disgust	Video	15	59.78%
Murugappan et al. (2013)	digest, sadness, fear, joy, neutral	Video	20	66.48%
Jerritta et al. (2014)	neutral, happiness, sadness, fear, surprise, disgust	Video	30	54%
Guo et al. (2016)	sadness, angry, fear, happy, relaxed	Video	25	56.9%
Dissanayake et al (2019)	anger, sadness, joy, pleasure	Video	25	80.00%

**An Ensemble Learning Approach for Electrocardiogram Sensor Based Human Emotion Recognition**  
Authors: Dissanayake et al (2019)  
Task: Results overview comparison

# Animal Emotions



- Difficult to define and quantify animal emotions
  - Less reliable dataset



- Benefits of examining animal emotions
  - Predicting the pain level intensity, animal protection, Communication is easier



- Comparison between human and animal emotions
  - Human -mixed emotions
  - Animals- simple and basic

## Animal Emotion Detection and Application

Authors: Singh et al (2021)

Task : Benefits of animal emotion detection

## Measuring Farm Animal Emotions -Sensor-Based Approach

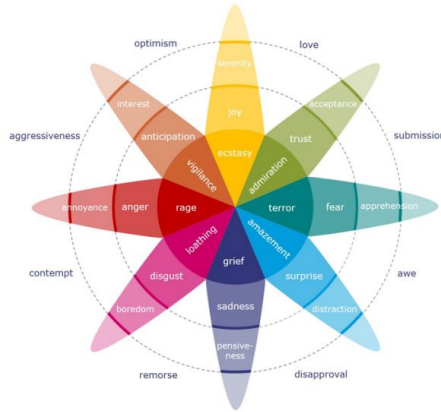
Authors: Suresh Neethirajan et al (2021)

Task : How to identify animal emotions

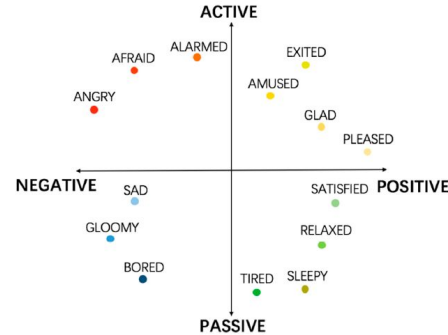
# Emotional Modeling

## Six basic emotions

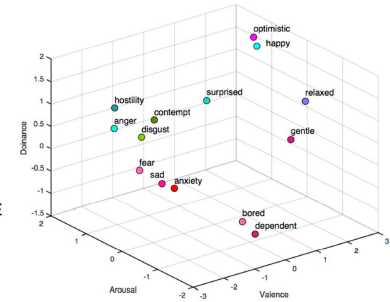
- Happiness
- Sadness
- Anger
- Fear
- Surprise
- disgust



Plutchik's Wheel of emotions



Two-dimensional space emotional model



Three-dimensional space emotional model

## Discrete Emotion Models

**Feel my heart: Emotion recognition using the electrocardiogram.**  
Authors: Magalhães et al (2021)  
Task : Emotion Models

## Affective Dimensional Models

**A Review of Emotion Recognition using Physiological signals**  
Authors: Shu L et al (2018)  
Task : Emotion Models



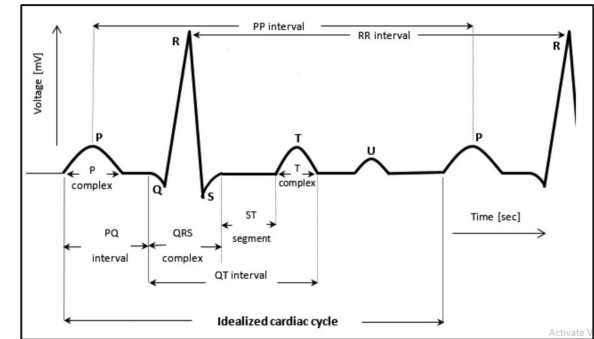
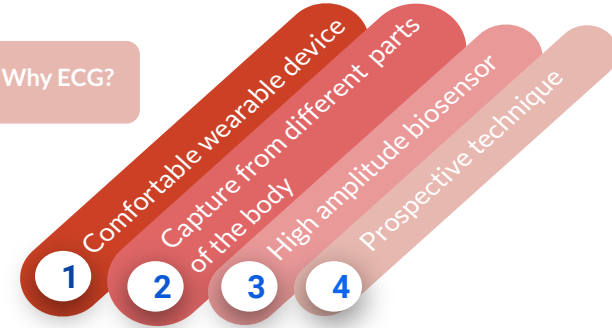
# Electrocardiography

- Analyze the heart's conduction system (electrical activity)
- Electrocardiogram (ECG)
  - assess the electrical activity of the heart.
  - Analyze psychological properties for emotion recognition
- Electrode placement - Arms, Legs, Chest
- Composed of three distinct waves:
  - P wave,
  - QRS complex
  - T wave.

**An Ensemble Learning Approach for Electrocardiogram Sensor Based Human Emotion Recognition**  
Authors: Dissanayake T et al (2019)  
Task: Why ECG is using to recognize emotions

**Electrocardiogram-Based Emotion Recognition Systems and Their Applications in Healthcare—A Review**  
Authors: Hansul et al (2021)  
Task : Detail about electrocardiography

Why ECG?



# ECG Datasets

Database	No.of Subjects	No.of Electrodes	Electrode Placement	Stimuli	Location
AMIGOS	40	3	Arms, Left Ankle	40 participants watched 16 short videos, 37 participants watched 4 long videos	Lab
ASCERTAIN	58	3	Arms, Left Foot	58 volunteers watched 36 movie clips between 51-127s	Lab
DECAF	30	3	Wrists, Arm (boney part)	40 1-minute music records 36 movie clips	Lab
DREAMER	23	3	Lead I and Lead II vector	18 affective videos 65 - 393s long	Isolated environment
MAHNOB-HCI	27	3	Chest	Image Tagging, 20 films 35-117s long	Lab
WESAD	15	3	Chest & Wrist	funny video clip, 5 min speech, guided meditation	Lab
SWELL	25	3	Chest	write reports and make presentations on predefined topics	Lab

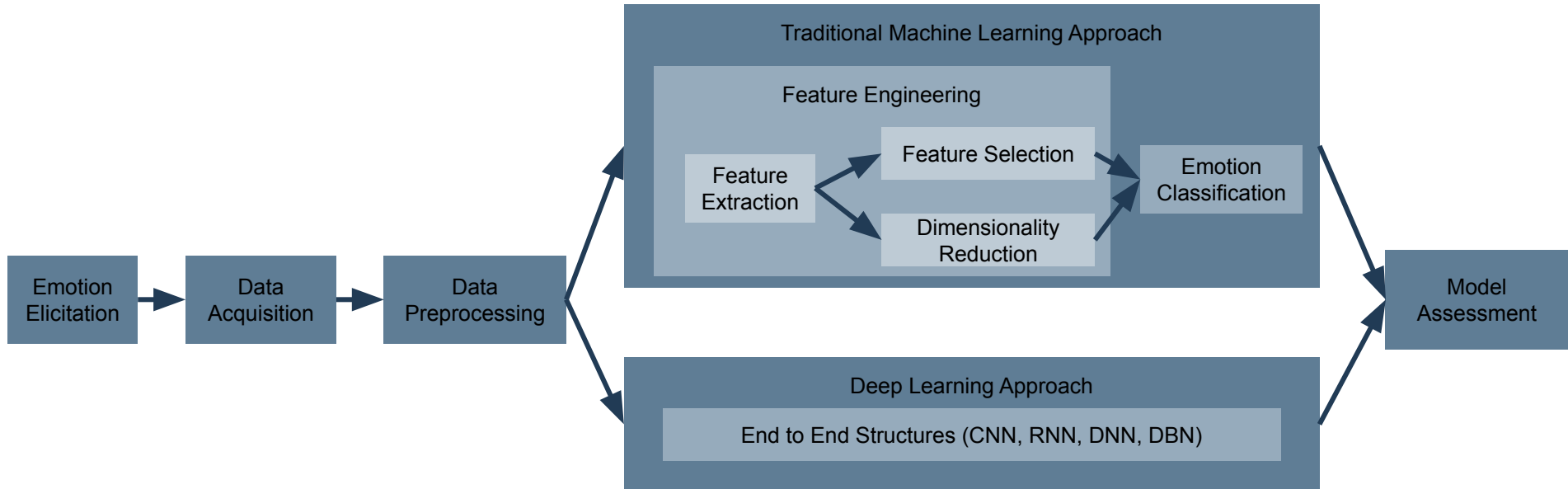
**Feel my heart: Emotion recognition using the electrocardiogram.**  
 Authors: Magalhães et al (2021)  
 Task : Emotion Models

**A Review, Current Challenges, and Future Possibilities on Emotion Recognition Using Machine Learning and Physiological Signals**  
 Authors: P. J. Bota et al (2019)  
 Task : Detail about different datasets

**Electrocardiogram-Based Emotion Recognition Systems and Their Applications in Healthcare—A Review**  
 Authors: Hansul et al (2021)  
 Task : Detail about different datasets

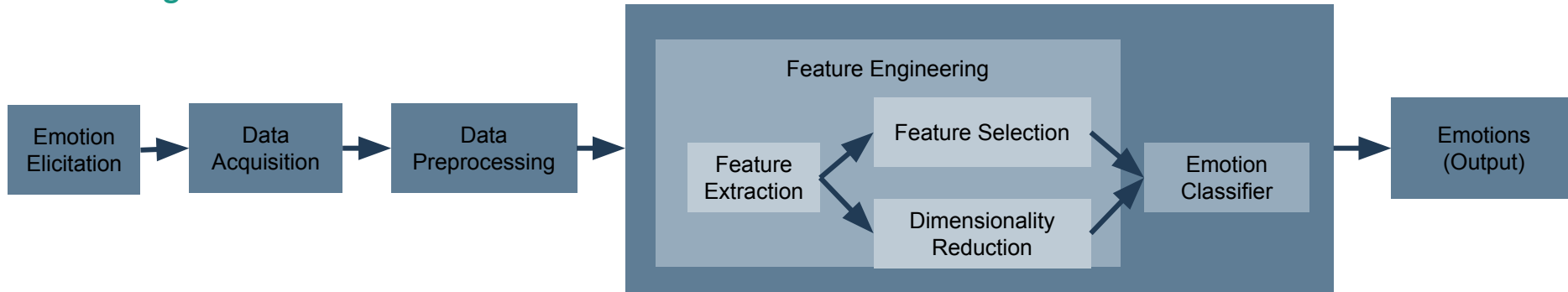
# Methodology

## Model Training Procedure



# Methodology cont...

## Testing Procedure



**Emotion Recognition using ECG Signals with Local Pattern Description Methods.**  
Authors: Tivatansakul et al (2015)  
Task : Testing procedure

**Electrocardiogram-Based Emotion Recognition Systems and Their Applications in Healthcare—A Review**  
Authors: Hansul et al (2021)  
Task : Methods for Machine Learning System

**Feel my heart: Emotion recognition using the electrocardiogram**  
Authors: Magalhães et al (2021)  
Task : Emotion Recognition process

# Emotion Elicitation



Audio Visuals

All basic emotions



Imagery

Happiness, Surprise, Fear, Anger



Music

Happiness, Sadness, Fear



Memory Recall

Happiness, Sadness, Disgust, Anger, Fear



Situational Procedures

Happiness, Anger, Fear, Surprise

**Electrocardiogram-Based Emotion Recognition Systems and Their Applications in Healthcare—A Review**

Authors: Hasnul MA et al (2021)

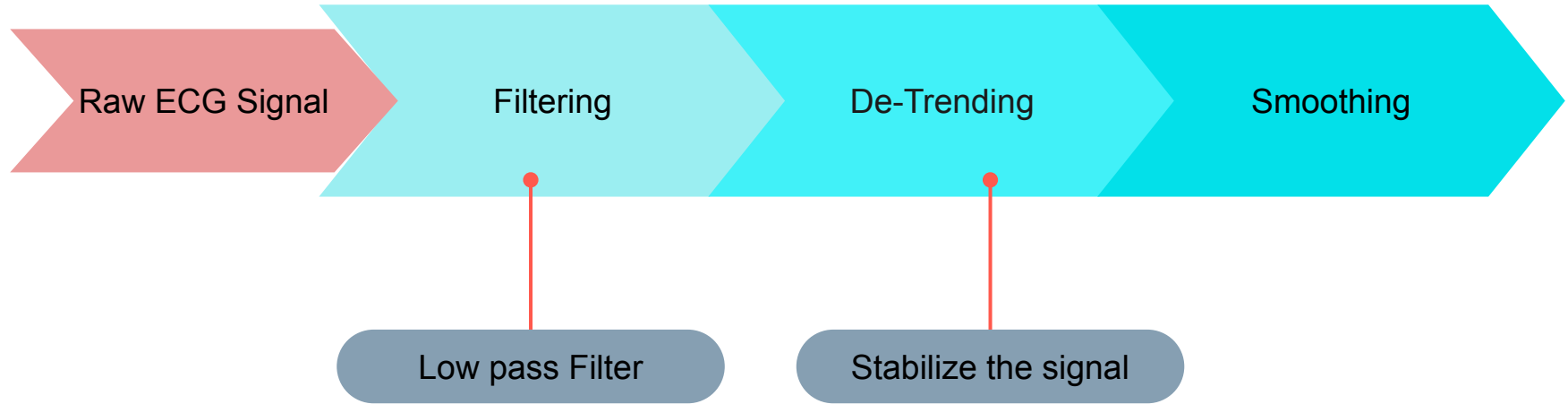
Task: Emotion elicitation techniques

**A Review, Current Challenges, and Future Possibilities on Emotion Recognition Using Machine Learning and Physiological Signals**

Authors: P. J. Bota et al (2019)

Task: Emotion elicitation techniques

# Signal Pre-processing

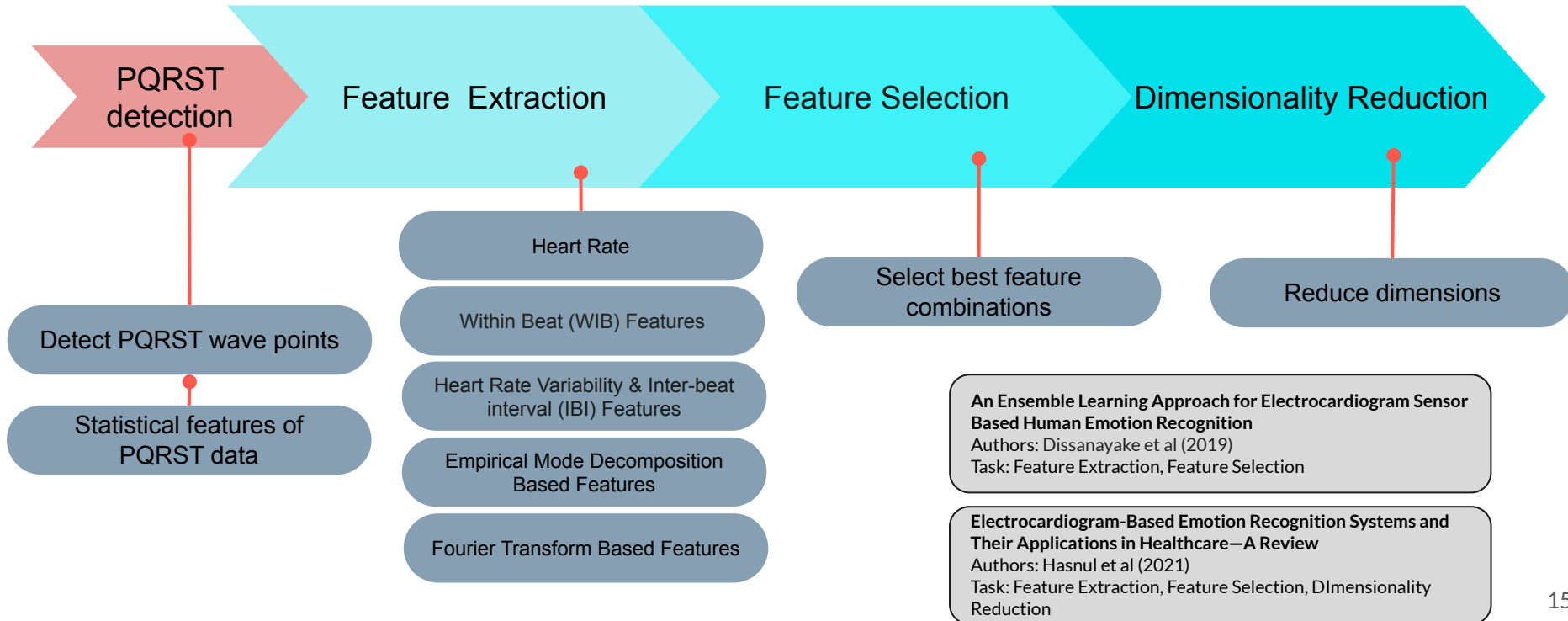


Butterworth filter is mostly used

**Electrocardiogram-Based Emotion Recognition Systems and Their Applications in Healthcare—A Review**  
Authors: Hasnul MA et al (2021)  
Task: ECG signal pre-processing

**An Ensemble Learning Approach for Electrocardiogram Sensor Based Human Emotion Recognition**  
Authors: Dissanayake T et al. (2019)  
Task: ECG signal pre-processing

# Feature Engineering



# Classification Models

SVM

Most popular classifier

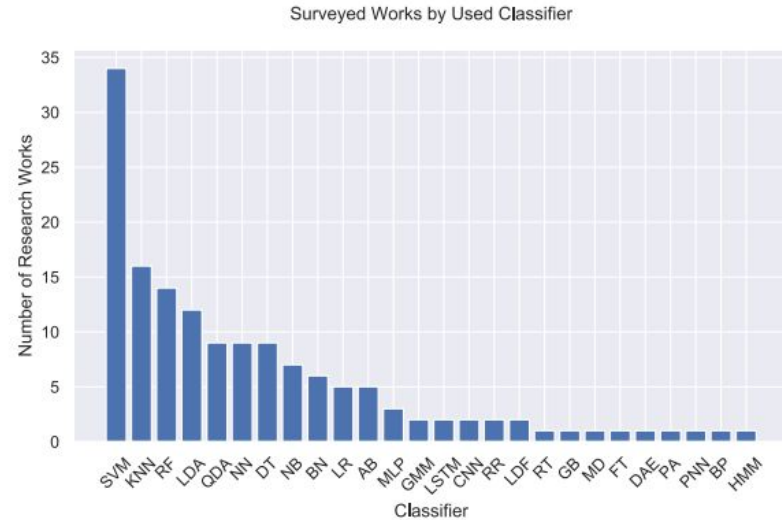
K-NN, Naive Bayes(NB), ...

Well performing classifiers

A Review, Current Challenges, and Future Possibilities on Emotion Recognition Using Machine Learning and Physiological Signals

Authors: P. J. Bota et al (2019)

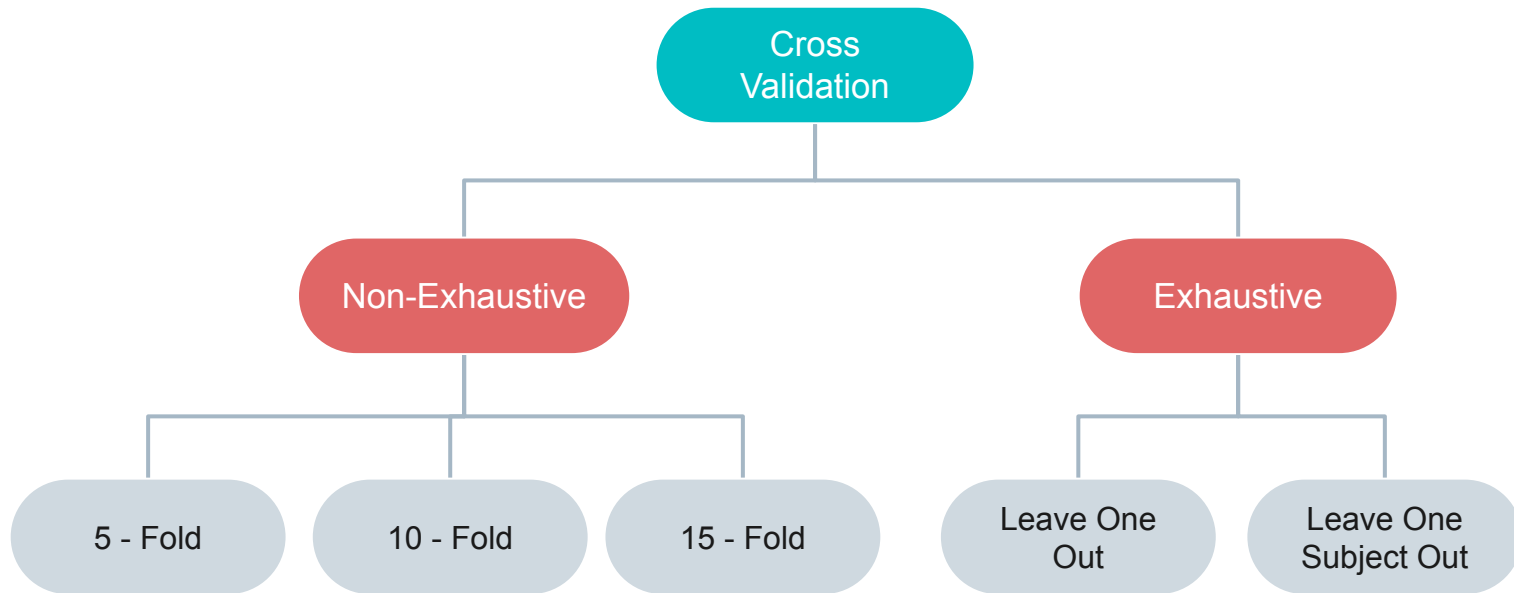
Task : Details about classification models



Histogram of the number of publications per classifier



# Validation



**Electrocardiogram-Based Emotion Recognition Systems  
and Their Applications in Healthcare—A Review**

Authors: Hansul et al (2021)

Task : Model validation methods

# Research Gaps

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01

## Data sets

Lack of affective databases with a large number of samples

Expanded ECG Data set

02

## Accuracy

Less number of Emotions have predicted

Improved Emotion Recognition Model

03

## Animal Emotions

Difficult to study animal emotions

Animal Emotion Detection Using Improved Model

# Q & A

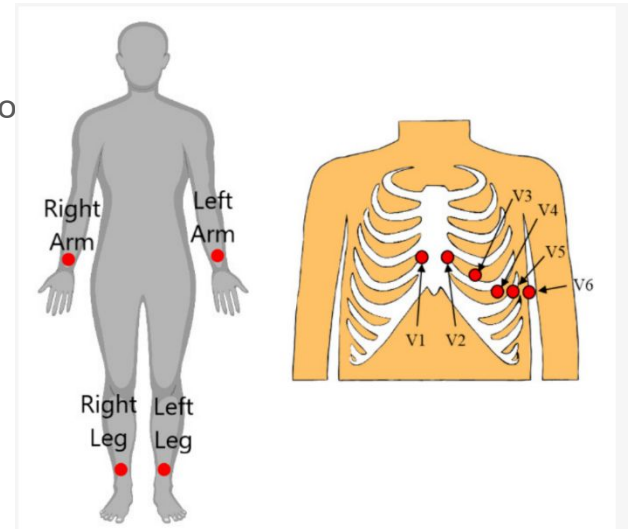
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# Thank You

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## Recap, highlights, justifications for next step

- Increase the number of processable samples in the dataset
- Collect data in uncontrolled environment
- Apply the model build using human emotions to identify animal emotions
- Build a dataset to train the model instead of using existing dataset
- 



- Affective computing is a field of study that integrates human affects and emotions with artificial intelligence into systems or devices
- humans rely on their own interpretation of facial and speech tone to infer the emotional states of other people.
- 
- WHY Emotion Recognition ? In order to understand behavior and make decisions
- 
- Newest scientific research - new techniques and methodologies
- Human-Computer Interaction (HCI)
  - Interaction with computers more productive and interactive.
  - Provide emotional intelligence to computing systems.
  - Entertainment, healthcare, etc...,
  - Major application areas cover patient monitoring, marketing, car driving.