# **An Efficient Interpretation Model for**

# People with Hearing and Speaking Disabilities



Inspiring Excellence

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Submitted on: 22<sup>nd</sup> August 2017

# **Declaration**

We hereby declare that this thesis report is our hard work put together, which has not been submitted anywhere for any award. All the contents written here are totally based on our unyielding labor and findings, dedicated to complete our undergraduate thesis. In this paper, we used information from other sources, which have been acknowledged and referred appropriately in the reference section.

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# Acknowledgement

All thanks to our Almighty, the superior of all, our merciful creator; who has given us the strength, patience and goodwill to complete this research.

Our thesis Advisor, Dr. Jia Uddin has been very kind to help and guide us throughout the journey. He has shared his knowledge and experience, to guide us the whole time to complete this thesis paper. It was an honor for us to work under him.

A very special thanks to our friends, Sauvik Kundu and Toqi Tahmid, students of this University and Department of Computer Science and Engineering, our fourth and fifth horsemen. Both of them are great people with big hearts and have helped us whenever we faced difficulty throughout this journey.

Lastly, thanks to our family and friends who have supported us all throughout the time. Things would not have been possible without their constant support.

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# **Acronyms and Abbreviations**

API – Application Program Interface IDE – Integrated Development Environment

ASL – American Sign Language IR – Infrared

CLR – Common Language Runtime ISL – Indian Sign Language

CNN- Convolutional Neural Network MFCC – Mel Frequency Cepstral Coefficients

D&M – Deaf and Mute. MVS – Microsoft Visual Studio

DTW – Dynamic Time Warping MKS – Microsoft Kinect Sensor

FPS – Frames per Second MSIL – Microsoft Intermediate Language

FSM – Finite State Machine RGB – Red, Green, Blue

GIT – Gesture to Image and Text. SGT – Speech to Gesture and Text.

Google STT – Speech-To-Text SL – Sign Language.

Google TTS – Text-To-Speech SVM – Support Vector Machine

GUI – Graphical User Interface VRS – Video Relay Service MVS

HMM – Hidden Markov models WFP – Windows Forms Applications

HSV – Hue, Saturation, Value WFD – World Federation of the Deaf

## **Abstract**

Sign language is a medium of communication between individuals who have hearing and speaking deficiency. Generally they are called Deaf and Mute. To have a better, effective and simpler communication between the vocal and non-vocal society, it is very important to understand their language without difficulty. Previous research works have shown us different types of efficient methods of interaction between these two sets of people. On the down side, however, they tend to focus on one sided conversation only. Our paper focuses on two very important things; one is converting the American Sign Language (ASL) to text word-by-word and the other is audio to gesture & text conversion. We used the microphone of Microsoft Kinect Sensor device; a camera; along with common recognition algorithm to detect, recognize sign language and interpret the interactive hand shape to American Sign Language text. We decided to build efficient system that can be used as an interpreter among the hearing impaired and the normal people. Besides helping as an interpreter, this research may also open doors to numerous other applications like sign language tutorials in the future.

#### Chapter 1

# Introduction

#### 1.1 Motivation

Our world has an immense cultural and lingual diversity. According to World Federation of the Deaf (WFD), there are approximately 70 million Deaf and Mute (D&M) people among us. Each language is unique with distinct culture and is expressed by visible hand gestures. "Just as spoken languages have evolved throughout the world, various signed languages have also emerged in different parts of the world. The languages may differ from region to region and country to country". [23]

This D&M part of society is always isolated from the people because the only method of communication is Sign Language (SL) whereas interpreters are not always available. Thus they are continuously dependent on another individual to convey what they need to say to people who do not understand SL. "Too often, lack of accessibility bars deaf people from sharing and learning information with others" [1].

## 1.2 Thesis goal

To assist them, in overcoming these feelings of helplessness and reliant, we are developing a complete computer based system. Our system would focus on two main methods of interaction; i) Speech to Gesture and Text conversion (SGT) and ii) Gesture to Image and Text conversion (GIT) word-by-word. In order to achieve this we would use a device called the Microsoft Kinect Sensor (MKS).

#### 1.3 Thesis Outline

In this thesis, we will discuss about –

• Chapter 02 – In this part, we discuss about the machineries, the software environment or tools we have used to do the thesis is described and also about the papers which we read through to complete this thesis.

- Chapter 03 This section discusses about how we designed our system with the appropriate models.
- Chapter 04 Here we talk about how the design, we mentioned in the earlier chapter, helps us.
- Chapter 05 How the program works, the results and performance is described in this portion, after the system implementation.

And lastly,

• Chapter 06 – Conclusion and Future Work are presented in this phase.

#### Chapter 2

# **Background Study**

## 2.1 System Description

#### 2.1.1 Introduction to the MKS (Microsoft Kinect Sensor)

Kinect is a motion sensing input device developed by Microsoft in early 2010 [10]. Kinect is mainly used in Xbox 360 console and for Windows PCs [10]. For Windows, a Kinect sensor consists of an RGB camera which can store up to three channel data of resolution 1280×960. It has an IR (infrared) emitter, which emits lights beams, and an IR depth sensor, that reads the reflected beams and processes the information to measure the distance between the object and the sensor. It also has a multi-array microphone that can capture sound and detect the location of the source and direction of the audio wave. It has a practical ranging limit of 40cm – 3.5m for Windows and the frame rate is 30 FPS (Frames per Second) [11]. Figure 1 depicts the picture of a Kinect.

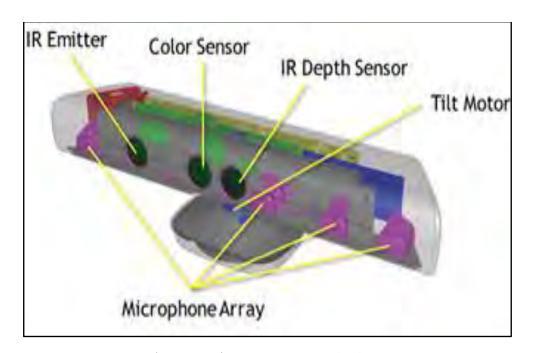


Figure 1: Kinect components [14]

#### 2.1.2 Kinect SDK

Kinect SDK enables developers to create applications in languages like, C++, C# or Visual Basic by using Microsoft Visual Studio (MVS) [12]. It is capable of capturing front body 2D motion, gesture, facial and voice recognition [11], skeletal tracking and advanced audio

capabilities [13]. To track gesture, we need Kinect sensor to record skeletal and depth data and capture the RGB video stream.

Core of the Kinect for the set of Windows API, supports fundamental image and device management features like, access to the Kinect sensors that are connected to the computer; access to image and depth data streams from the Kinect image sensors and delivery of a processed version of image and depth data to support skeletal tracking. Figure 2 shows interaction method of sensor Hardware with software of an application.

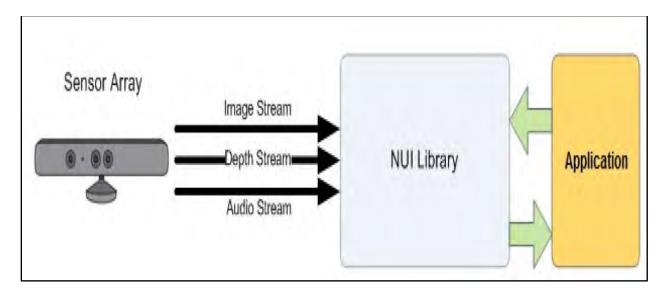


Figure 2: Hardware and software interaction with an application [3]

In addition, the software has the capability to recognize and track human body. The software runtime converts depth data into about 20 skeleton joint points of human body to track up to two persons in front of the camera [14].

#### 2.1.3 Kinect Hardware

Including the Kinect sensor and the USB hub, through which the sensor is connected to the computer [15].

#### 2.1.4 Kinect Drivers

Microsoft provides Windows (7, 8, 8.1, or 10) drivers for the Kinect sensor [15].

#### 2.1.5 Microsoft Visual Studio (IDE)

Microsoft visual studio (MVS) is an integrated development environment (IDE) from Microsoft. It is an integrated solution which enables the users to develop console and graphical user interface (GUI) applications along with Windows Forms Applications (WFP), web sites, web applications, web services and so on[16].

MVS supports almost all kinds of programming languages including built-in languages such as C, C++ [16] (via Visual C++), VB.NET (via Visual Basic .NET), C# (via Visual C#), and F# (as of Visual Studio 2010) [17]. All of these languages are built on top of the .NET Runtime (known as Common Language Runtime or CLR) and produce the same intermediate output in Microsoft Intermediate Language (MSIL) [19]. Like any other IDE, it includes a code editor that supports syntax highlighting and code completion, using IntelliSense for variables, functions, methods, loops and LINQ queries [20].

IntelliSense is supported for the included languages, as well as for XML and for Cascading Style Sheets and JavaScript when developing websites and web applications [21, 22]. Autocomplete suggestions appear in a modeless list box over the code editor window, in proximity of the editing cursor. In Visual Studio 2008 onwards, it can be made temporarily semi-transparent to see the code obstructed by it [21]. The code editor is used for all supported languages.

#### 2.1.6 Camera

We have to take gestures as individual images for input in the Gesture to Image and Text (GIT) part. Sign gestures can be captured by different types of cameras, like smart phone camera, webcam etc.

## 2.1.7 Display/Screen

To give the user a mirrored image impression there is a screen or display in front of the user. Data processing has to be accurate and mirroring the real time video essential in order to give the user an impression of mirror.

#### 2.2 Related Research

Many research works, related to sign language, have been done. People, who are not deaf, usually do not try to learn the sign language for interacting with those who have hearing difficulties. Finding an experienced and qualified interpreter every time is a very difficult task and not always affordable. This becomes a cause of isolation for the deaf people. However, if a computer can be programmed in such a way that it can translate sign language to text format and vice versa, the gap between the normal people and the deaf community can be minimized.

"A gesture in a sign language is a particular movement of the hands with a specific shape made out of them" [25].

Sign language can provide gesture for letters to perform words that do not have corresponding sign in that language. Though there are papers to recognize such letters, using gesture from the MKS, and forming words combining those letters. A sign language usually provides sign for whole words and papers relating signs to specific words are limited.

Kakde et al. worked on signs recognition and convert to text and speech using web camera for taking inputs, then performing the YCbCr color transformation and Principle Component Analysis (PCA) algorithm for feature extraction [2]. In [3], Ghorpade et al. have a new technique called artificial speaking mouth for dumb people. They have used hand gloves to perform hand gesture, acoustic pre-processing for voice input, Mel Frequency Cepstral Coefficients (MFCC) for feature extraction and Hidden Markov models (HMMs) for speech recognition.

Ear hear is an android application for deaf people to communicate with normal people, which has been worked on by Subhaashini et al. [4]. The Speech-to-Sign and Sign-to-Speech technology are implemented using VRS (Video Relay Service). Similarly, Krishna also designed an android application, which will detect the ISL via mobile camera and convert it into corresponding text or voice output [6]. He has used gesture recognition using video and image processing using histogram method to keep track of the pixels using RGB (red/green/blue) and HSV (hue/saturation/value) for skin color dictation.

Matiwade et al. have developed a hand glove with flex sensor that can interpret English letters, numbers and some Indian sign language (ISL) for the project they have used Gesture, Flex

Sensor, ARM7TDMI, Text-To-Speech Conversion algorithms [5]. While Ahire et al., [7], have explained in their paper how they extracted gesture from real time video and mapped it in human understandable speech. In the second section they have converted natural language into animated sign gesture. They have used frame fragmentation Google Text-To-Speech (TTS) API and Google Speech-To-Text (STT) API in their project.

Archana and Gajanan have proposed two algorithms; (a) Rule based and (b) Dynamic Time Warping (DTW) for ISL word recognition where they have deduced that DTW is better than rule based approach and for sentence creation, they used inverted indexing concept [8]. Shreyashi [9] captured the signs of all 26 alphabets by webcam; pre-processed for feature extraction using HSV color model and compared the obtained features by using the PCA algorithm. For Image segmentation, they used Otsu algorithm and for feature extraction, they used Centroid, skin color and principal component as main feature.

# **Design and Implementation**

## 3.1 Proposed Model

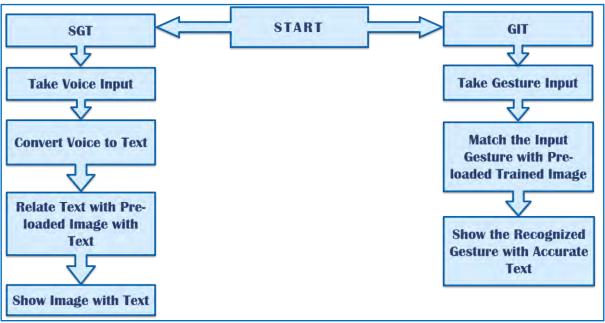


Figure 3: Proposed Model

Left (i. Speech to Gesture and Text)

Right (ii. Gesture to Image and Text)

## 3.2 Model Description

#### 3.2.1 Speech to Gesture and Text

The method, shown in Fig. 3(i), aims to make a normal person able to communicate successfully with a deaf and mute person. A normal human being is capable of giving natural language as input from his side. So, in order to process this natural language, the first step is to generate text data out of audio speech data.

It is easy to process to text data as compared to audio speech signals. There are several platforms those provide us with all the required functionalities and provisions to translate audio speech to corresponding text for further processing.

All the extracted characters from the converted text are then matched with the gesture images that are already stored in data set. Finally, the user will get a sequence of gesture images for the corresponding text, including a subtitle.

We have already tried SGT in C sharp language where we have given the input from a normal microphone. We have used XML for making the UI of the system, speech reorganization engine library for recognizing the speech. Here a sentence can take a maximum of six words and show the gesture along with the subtitle.

However, there are some difficulties we are facing while taking the audio input, because of the background noise sometimes the excepted gesture are not showing. To minimize the problem we have decided to use the in-built Kinect microphone. Moreover, one of the challenges that we are willing to take in future work is making a perfect sentence with correct grammar rule. Our current output shows a sentence as "father mother go home" but we will change the structure of the sentence as "Father and mother are going home". So, basically we will use the to-be verbs, i.e. am, is, was, were etc. in the sentence.

#### Pseudo code:

```
Initialize KinectSensor, ImageArray, Choices
load kinect
check connectivity
initialize images, labels
recEng_speech_method()
if click->speak
print sequence of images with labels
clear_AllClick_Method()
else click->stop
```

Figure 4: Pseudo code SGT

#### 3.2.2 Gesture to Image and Text (Fig. 3(ii))

#### 3.2.2.1 CNN (Convolutional Neural Network)

"A CNN consists of an input and an output layer, as well as multiple hidden layers. The hidden layers are either convolutional, pooling or fully connected" [27].

Neural networks are able to make predictions by learning the relationship between features of the data and some observed response.

In Convolutional (filtering and encoding by transformation) Neural Networks (CNN), every network layer acts as a detection filter for the presence of specific features or patterns present in the original data. The first layers in a CNN detect large features that can be recognized and

interpreted relatively easy. Later layers detect increasingly smaller features that are more abstract and are usually present in many of the larger features detected by earlier layers. The last layer of the CNN is able to make an ultra-specific classification by combining all the specific features detected by the previous layers in the input data.

#### 3.2.2.2 Image matching using CNN (Convolutional Neural Network)

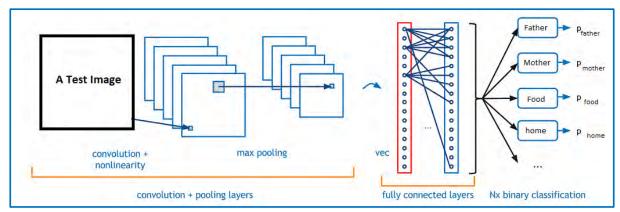


Figure 5: How CNN Works

#### 3.2.2.3 Data Augmentation

Due to the small amount of data, data augmentation is used to augment the dataset. Rotation, horizontal flip, width shift range, height shift range, zoom, channel shift have been used for this process.

#### 3.2.2.4 Fine-Tune PretrainedConvNets

In [28], "For image classification pretrained convolutional neural network is used". TensorFlow and Keras are used to train our model. We have used Inception V3 model pretrained with ImageNet dataset. To train our model, we exclude the last fully connected layer from Inception V3 and include a new fully connected layer which size is the number of our class.

All of the layers of the model were "freezed", except the last fully connected layer, and then trained for 5 epochs. Then we unfreeze the layers that we froze previously and again train the

model for 24 epochs. The training accuracy of the image matching model is 94.38% and testing accuracy is 95.65%.

# 3.2.2.5 Final Prediction

"In final result our program gives an output showing which class each test image belongs to and shows the probability of falling into that category" [29].

# Chapter 4

# **Result and Analysis**

# 4.1 Dataset

We have collected lots of sign gestures and use those gestures in our database. These sign gestures are stored in the database.

# 4.1.1 SGT Dataset

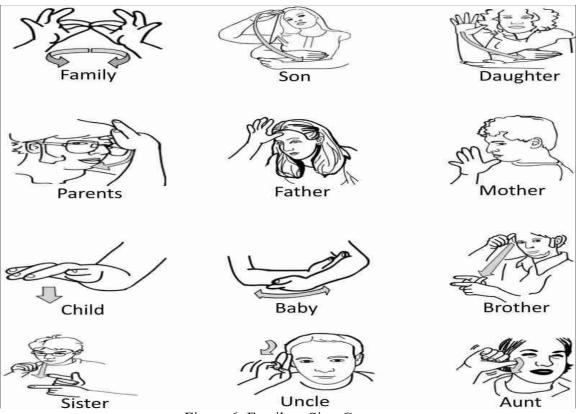


Figure 6: Family – Sign Gesture

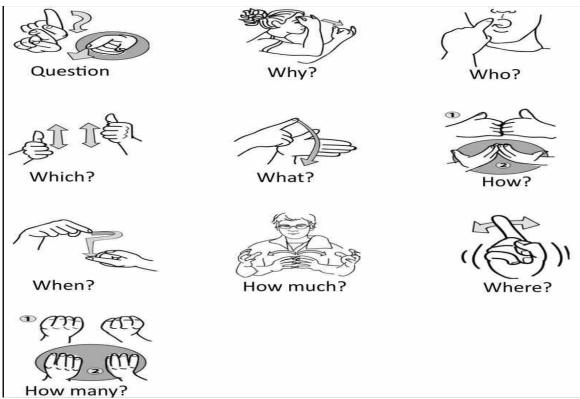
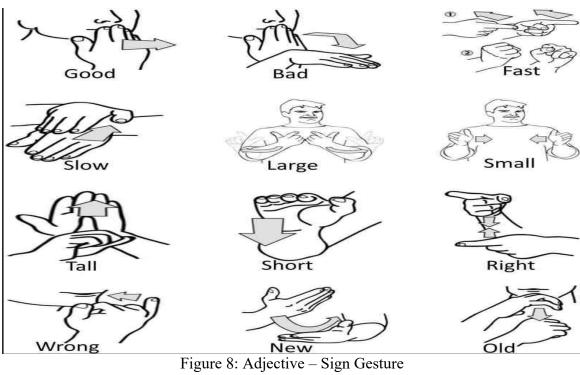


Figure 7: Question – Sign Gesture



#### 4.1.2 GIT Dataset

On the other half of our project, we have collected some data of various gestures from different people. In our dataset, these people are performing different sign gestures. We have collected the input data with the help of a smart phone camera. Here some people are performing sign gestures in front of the camera, which we take as the dataset for the second part of our project.



Figure 9: Gesture Dataset

Top Left to Right (i. father, ii. home, iii. food, iv. Home)

Bottom Left to Right (v. important, vi. home, vii. mother, viii. Thirsty)

# 4.2 Result

# 4.2.1 Analysis of SGT

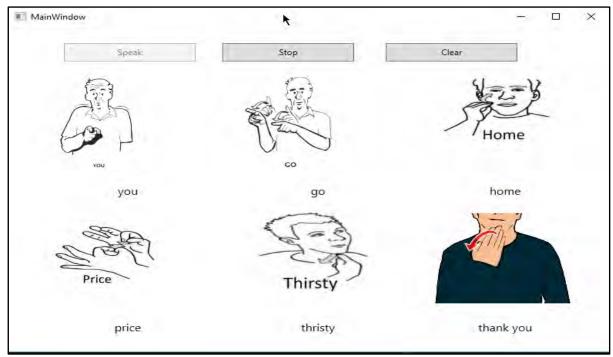


Figure 10: Gesture and Text (i)

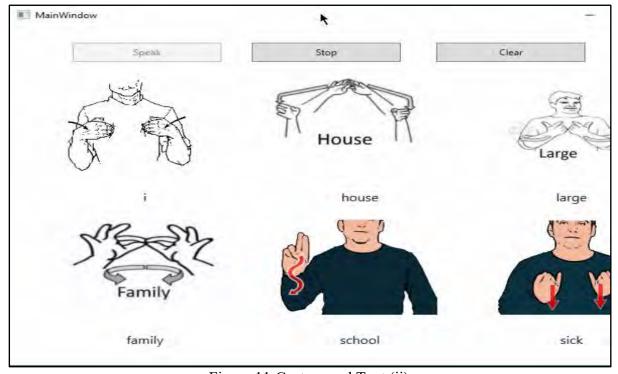


Figure 11:Gesture and Text (ii)

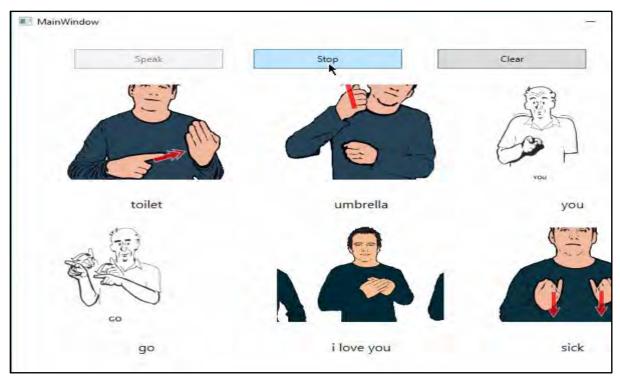


Figure 12: Stop (taking input)



Figure 13: Clear Window

Before starting the procedure of converting Sign to Gesture and Text (SGT), we should go through the following two tests;

◆ Check background noise: Kinect monitors the ambient noise level in the activity area. If the level is too high, the sensor displays a message asking the user to check for noises

in the room and then to restart the calibration after the user has muted any background noise.

♦ Check speaker volume: User plays a series of tones for Kinect to hear to calibrate the audio playback level. If the audio tones are too low, a message asks the user to turn up the volume of the speakers. If the sound levels are loud enough, a comment informing that the audio check was successful will be seen.

If the tests are successful, the Kinect sensor's microphone self-calibrates. This is automatic, so the users do not have to do anything during the process. It should take only a few seconds for the self-calibration to complete.

To convert Speech to Gesture and Text (SGT), we access a window as shown in Figure 10.

#### Speak

When we click the "Speak" button, our voice is taken as input through the Microsoft Kinect Microphone. The words in our voice input are compared with the gesture images preloaded in the database. The matched words are displayed as subtitle along with their respective gesture images above it. Figure 10 and 11 show an example.

#### Stop

As we press the "Stop" button, the system discontinues taking any further voice input but does not remove the output from the screen as we can see from Figure 12.

#### Clear

From Figure 13, we can see that as we give the "Clear" command, the screen removes all the previous outputs. We can reuse the technique by clicking the "Start" button again.

# 4.2.2 GIT Analysis



Figure 14: GIT – Home



Figure 15: GIT – Food

## **4.2.2.1 Trained Images**

We have trained our algorithm using the model TensorFlow and Keras sensor. In [30], "TensorFlow is an open-source software library for machine learning across a range of tasks, and developed by Google to meet their needs for systems capable of building and training

neural networks to detect and decipher patterns and correlations, analogous to the learning and reasoning which humans use". TensorFlow is the best way to build deep learning models.

Keras is an open source library neural network written in Python. Designed to enable fast experimentation with deep neural networks, it focuses on being minimal, modular and extensible.

In this segment of our project, we have very carefully trained all the images of same gesture, as shown in Fig. 13, but with different person so that it can remember that how the image is actually defined.

#### 4.2.2.2 Test validation

Convolutional Neural Network (CNN) tests an input image by breaking it into overlapping image tiles; feed each image tile into a small neural network and save the result from each tile into a new array down sampling. In this research, the computer compares the input with the trained gestures, Fig. 13; identifies it with the help of the trained ones and calculates out how accurate the result is. Here in this portion, we have got a satisfying output after the training.

#### Chapter 5

# **Conclusion and Future Work**

#### 5.1 Conclusion

Our research aims to provide a Two-Way Communicator between People with Hearing-Speaking disabilities and ourselves and also to bridge the interaction gap between these two sections of the society. In Speech to Gesture and Text (SGT), we have used the Kinect microphone and the obtained result is better than that from a normal microphone. On the other hand, in Gesture to Image and Text (GIT), we have used Convolutional Neural Network (CNN) algorithm and the framework TensorFlow and Keras to train images and get the desired output.

#### **5.2 Future Work**

We would focus on developing a system on gesture recognition that interprets and converts hand signals to text, i.e. GIT using the Microsoft Kinect System (MKS). Our aim would be to develop such a system, which would take sequence of images that contains SL as input and gives us sentences as output.

Plus, a part of our system is Kinect hardware based and so it might not be affordable or accessible for everybody. Thus, we aim to build a compact system, in the future, so that people can freely access and use it in their smart phone.

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