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University of Augsburg
Faculty of Applied Computer Science
Department of Computer Science
Bachelor's Program in Computer Science



#### Bachelor's Thesis

## Engagement Detection

# Inferring conversational engagement from nonverbal behaviour

submitted by Amr Abdelraouf on 31.7.2014

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#### **Abstract**

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# Statement and Declaration of Consent

#### **Statement**

Hereby I confirm that this thesis is my own work and that I have documented all sources used.

Amr Abdelraouf

Augsburg, 3.7.2014

#### **Declaration of Consent**

Herewith I agree that my thesis will be made available through the library of the Computer Science Department.

Amr Abdelraouf

Augsburg, 3.7.2014

## **Contents**

Co	ntents	i
1	Introduction	1
	1.1 Motivation	1
	1.2 Objectives	1
	1.3 Outline	1
2	Theoretical Background	3
	2.1 Setup	3
	2.1.1 Subject	3
	2.1.2 Agent	3
3	Events	5
	3.1 Event Structure	5
	3.2 Sensors	5
	3.2.1 Microsoft Kinekt	5
	3.2.2 SMI Eyetracker	6
	3.2.3 Microphone	6
	3.3 Scenemaker	6
4	Main Modules	7
	4.1 Mutual Facial Gaze	7
	4.2 Directed Gaze	7
	4.3 Adjacency Pair	7
	4.4 Bachchanneling	7
5	Bayesian Network	9
6	Summery	11

ii	CONTENTS
Bibliography	13
A First Appendix	17
List of Figures	19
List of Tables	20

## Introduction

#### 1.1 Motivation

This thesis was proposed to help measure the engagement of an interviewee in a job interview situation. Through a simple mock interview the interviewee will be assessed on his/her performence. One of the most important attributes of that performence is whether or not s/he is engaged with and attentive to the interviewer. A simple playback of his/her performence coupled with the measurment of his/her engagement level will easily highlight weak spots in the mock interview.

#### 1.2 Objectives

This thesis aims to measure the engagement levels of an interviewee through non verbal behaviour of said interview. It studies the conversational interaction with the interviewer, the responses to certain commands, his/her behaviour during certain segments of the interview.

#### 1.3 Outline

This thesis is divided into three main sections. First it introduces the raw input data that will be used for processing each module of the engagement detection. Then it will explain the main modules used for this thesis in detail. And finally it will explain how the data comes together at the end to produce a level of engagement.

## Theoretical Background

#### 2.1 Setup

#### 2.1.1 Subject

The subject of our expirament is the interviewee in our mock interview. The subject is seated approximately 30 cm from a screen. The subject is asked to adjust to a number of sensors: a Microsoft Kinekt camera, an SMI Eyetracker and a microphone.

#### 2.1.2 Agent

The agent in our expirament is a reference to the interviewer. The agent is simulated by Scenemaker: a software that is used to create a virtual environment and virtual characters that follow a written script. This script contains sentence utterences, gestures, and commands to wait for a reply from the subject. The main scene used contains two virtual agents named Curtis and Gloria who are standing behind a desk to mimic an office interview. On the left lies a white board that is used as an object in our script.

#### **Events**

Events are the backbone of the software workings of this thesis. Raw sensor data are converted to events that can be further processed in the software's pipeline. Furthermore external software send events to our own software over a network. These events can be displayed by themselves as output or can be used as inputs to trigger other events.

#### 3.1 Event Structure

Events are constructs of several attributes: Time: The clock signature of when the event was triggered. Duration: The time duration of the event. Ptr: Meta data about the event. Type: The type indicates the nature of the meta data wrapped by the event.

#### 3.2 Sensors

#### 3.2.1 Microsoft Kinekt

Kinekt sensors are used to track the skeletal movements of a subject. However in this module we are mainly interested in the movement of the subject's head. Kinekt is used to detect the prepetual displacement of the subject's head which indicates that s/he is nodding. This triggers an event called *HeadNod*. HeadNod is an event measured every 500 ms and its pointer contains a value from 0 to 1 which represents the probability that the subject is nodding his/her head.

#### 3.2.2 SMI Eyetracker

The SMI Eyetracker is used to pinpoint where the subject is currently looking. Since we are dealing with a virtual agent on a screen we consider the top left corner of the screen as the (0,0) coordinate. Displacement to the right and bottom of the looking point on the screen change the values of the x and y coordinates respectively.

The software defines two main areas on the screen. First is the area of the Agent's face. Second is the area of the board that is present in the environment.

When the subject's looking point falls on the area defined for the agent's face it triggers an event called *SubjectFacialGaze*. SubjectFacialGaze's pointer contains a value of either 0 or 1 indicating whether or not the subject is looking at the agent's face. When the gaze enters the facial area SubjectFacialGaze is triggered with the value 1 indicating that it has started and when the gaze leaves the facial area it is triggered with the value 0 indicating that it is complete.

If the subject's gaze falls in the area of the board the event *SubjectO-bjectGaze* is triggered. Similar to SubjectFacialGaze, the event carries a value of either 0 or 1 indicating whether or not the subject is looking at the board, value 1 when it starts and value 0 when it ends.

#### 3.2.3 Microphone

A microphone is used to record the verbal utterances produced by the subject. When the microphone detects a voice the event vad (which is short for..) is fired. When the voice is first detected the event's pointer carries a value of 1. When the voice activity ends the same event is triggered but with value 0 to indicate that the event is complete.

#### 3.3 Scenemaker

## Main Modules

- 4.1 Mutual Facial Gaze
- 4.2 Directed Gaze
- 4.3 Adjacency Pair
- 4.4 Bachchanneling

## **Bayesian Network**

# Summery