# LIP SYNCING METHOD FOR REALISTIC EXPRESSIVE THREE-DIMENSIONAL FACE MODEL

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UNIVERSITI TEKNOLOGI MALAYSIA

# LIP SYNCING METHOD FOR REALISTIC EXPRESSIVE THREE-DIMENSIONAL FACE MODEL

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To the tender fountain who provided me with perseverance, My Parents

To the source of kindness who provided me with ambition, My Sister (Fayza), My
Husband (Qays) and My Kids (Farah and Yousif)

For those who provided me with supervision and constant support, My Supervisors

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To my colleagues in the Universiti Teknologi Malaysia

To all those who contributed to the success of this research

I dedicate this research to you

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#### **ABSTRACT**

Lip synchronization of 3D face model is now being used in a multitude of important fields. It brings a more human and dramatic reality to computer games, films and interactive multimedia, and is growing in use and importance. High level realism can be used in demanding applications such as computer games and cinema. Authoring lip syncing with complex and subtle expressions is still difficult and fraught with problems in terms of realism. Thus, this study proposes a lip syncing method of realistic expressive 3D face model. Animated lips require a 3D face model capable of representing the movement of face muscles during speech and a method to produce the correct lip shape at the correct time. The 3D face model is designed based on MPEG-4 facial animation standard to support lip syncing that is aligned with input audio file. It deforms using Raised Cosine Deformation function that is grafted onto the input facial geometry. This study also proposes a method to animate the 3D face model over time to create animated lip syncing using a canonical set of visemes for all pairwise combinations of a reduced phoneme set called ProPhone. Finally, this study integrates emotions by considering both Ekman model and Plutchik's wheel with emotive eye movements by implementing Emotional Eye Movements Markup Language to produce realistic 3D face model. The experimental results show that the proposed model can generate visually satisfactory animations with Mean Square Error of 0.0020 for neutral, 0.0024 for happy expression, 0.0020 for angry expression, 0.0030 for fear expression, 0.0026 for surprise expression, 0.0010 for disgust expression, and 0.0030 for sad expression.

#### **ABSTRAK**

Penyelarasan bibir bagi model muka 3D kini digunakan dalam pelbagai bidang yang penting. Ia memberi sentuhan yang lebih bersifat manusia dan realiti dramatik kepada permainan komputer, filem dan multimedia interaktif, dan berkembang dari segi penggunaan dan kepentingan. Realisme peringkat tinggi boleh digunakan dalam aplikasi yang mencabar seperti permainan komputer dan pawagam. Mencipta penyegerakan bibir dengan pengucapan yang kompleks dan halus masih sukar dan penuh dengan masalah dari segi realisme. Justeru, kajian ini telah mencadangkan kaedah penyegerakan bibir realistik model muka 3D ekspresif. Bibir animasi memerlukan satu model muka 3D yang berkebolehan untuk mewakili pergerakan otot muka semasa pengucapan dan satu kaedah untuk menghasilkan bentuk bibir yang betul pada masa yang sesuai. Model muka 3D tersebut direka berasaskan animasi muka standard MPEG-4 untuk menyokong penyegerakan bibir yang diselaras dengan input fail audio. Ia berubah bentuk menggunakan fungsi Ubah Bentuk Kosinus Yang Dinaikkan yang mana ia dicantum kepada geometri input muka. Kajian ini juga telah mencadangkan satu kaedah untuk menghidupkan model muka 3D dari masa ke masa untuk membuat penyegerakan bibir animasi menggunakan satu set viseme berprinsip untuk semua kombinasi pasangan fonem dipanggil ProPhone. vang dikurangkan yang Akhir sekali, kajian mengintegrasikan emosi dengan mempertimbangkan kedua-dua model Ekman dan roda Plutchik dengan pergerakan mata beremosi dengan melaksanakan Bahasa Pergerakan Mata Beremosi untuk menghasilkan model muka 3D realistik. Keputusan eksperimen menunjukkan bahawa model yang dicadangkan ini boleh menjana animasi visual yang memuaskan dengan Min Kuasa Dua Ralat adalah 0.0020 untuk neutral, 0.0024 untuk ekspresi gembira, 0.0020 bagi ekspresi marah, 0.0030 untuk ekspresi rasa takut, 0.0026 untuk ekspresi kejutan, 0.0010 untuk ekspresi jijik, dan 0.0030 untuk ekspresi sedih.

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### LIST OF ABBREVIATIONS

3D - Three Dimension

APML - Affective Presentation Markup Language

AU - Action Unit

BEAT - Behavior Expression Animation Toolkit

BML - Behavioural Markup language

CCA - Canonical Correlation Analysis

CFDF - Raised Cosine Deformation Functions

CML - Cognitive Modelling Language

ECA - Embodied Conversational Agent

EEMML - Emotional Eye Movement Markup Language

FACS - Face Action Coding System

FaceGen - Face Generation

FAP - Face Animation Parameter

FAPU - Face Animation Parameter Unit

FAT - Face Animation Tables

FDP - Feature Description Parameter

FP - Feature Points

HML - Virtual Human Markup Language

LDA - Linear Discriminant AnalysisMPEG-4 - Moving Picture Experts Group

MPML - Multimodal Presentation Markup Language

OCC - Ortony Clore and Collins Model for emotions

PAD - Pleasure, Arousal and Dominance

PC - Principle Components

PCA - Principle Components Analysis

ProPhone - Priority Phone

SAPI - Speech Application Program Interface

SMIL - Synchronized Multimedia Integration Language

TTS - Text To Speech

VC - Virtual Character

VHML - Virtual Human Markup Language

VW - Virtual World

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# LIST OF SYMBOLS

CC - Correlation Coefficient

D - Dimension

 $\gamma \hspace{1cm}$  – Dimension of the ground truth

 $\upsilon_{\,j}$  — The set of vertices

 $\upsilon$  - Average standard deviation

 $\rho$  - Empowered constant

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#### **CHAPTER 1**

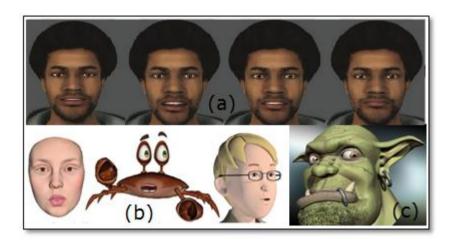
#### INTRODUCTION

#### 1.1 Introduction

Face is the central element for expressing human emotion and personality (Xu et al., 2013). Lip syncing is a process of speech assimilation with the lip motions of a 3D face model. A talking model is a challenging task because it should provide control of all articulatory movements and must be synchronized with the speech signal. Many different types of vital information are detectable through lip syncing. Lately, many applications of computer facial animation in the foundation of 3D face model with diverse facial expressions are used in entertainment and other fields. An attractive application can advance the interaction between users and devices via interactive virtual speech, and thereby attract users by providing a pleasant interface. With the advent of computer-aided technologies, animated virtual characters are widely used in movies, games and embodied conversational agents (ECAs) to provide an effective and realistic human computer interaction.

Since the early 1990's researchers have focused on developing Embodied Conversational Agents (ECA) or Virtual Character (VC) for interactions with humans in social situations. The introduction of these models created a ripple effect in several fields such as filming and animation. Creation of interactive graphical user interfaces

has been one of the long term goals in this area of research and has become one of the most significant branches of Human Computer Interaction research (HCI). Figure 1.1 shows some examples on lip syncing of 3D face model.



**Figure 1.1** Examples on Lip Syncing of 3D Face Models (a) Wei and Deng, 2015, (b) Xu *et al.*, 2013, (c) Maya Lip Syncing 2014.

Recently lip syncing has gained wide acceptance in the field of Human-Computer Interaction. These models show a realistic human face and talk in social situations with emotions such as in e-learning system, healthcare system, e-retail environments and games. Lip syncing usually has an interface which is backed up by a suitable dialogue manager and knowledge base. The 3D face model are capable of using voice; animated dialogue with lips and face appearances; eye, head, and body movements to comprehend signals; expressions of emotions; and execute actions or exhibit hearing or imagining postures (Xu *et al.*, 2013). The presence of these 3D face models has had a positive impact on user experience as reported in previous works (Cassell, 2000; Oyarzun *et al.*, 2010; Yang *et al.*, 2011; Stevens *et al.*, 2013; Ding *et al.*, 2013)

Revelation of human emotion via facial animation is definitely an intricate subject matter in computer graphics, artificial intelligence, physiology, and communication (Cai *et al.*, 2010) (Lee *et al.*, 2011). Creation of a pragmatic face expression is a tricky task because of all-inclusive facial structure. In addition, humans are exceptionally recognizable with facial motions and can easily recognize microscopic details that are deviant or contradictory in an animated face. Truly, the

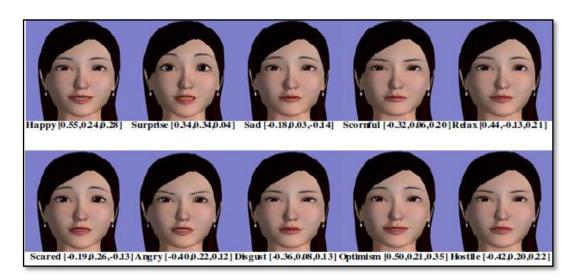
amalgamation between eye movements, lip syncing, motions, appearances of emotions on face, and body direction provide clues regarding flow of thoughts, sequences of thoughts in decision making and depth of understanding and knowing. The alignment of audio with the utterance is so important to get realistic lip syncing. The gaze and saccadic eye movements that speak a lot about the thinking process in human mind are often referred as "window to the mind". Eye movements blended with the expressive gaze convey significant nonverbal information and emotional intentions when a person speaks.

The efficacy of an agent banks on a major factor which is credibility. 3D face models have been made more believable by incorporating emotions. It is very important for these characters to have emotions because they will absolutely increase the user understanding and experience (Cassell, 2000; Deng and Neumann, 2008; Mlakar and Rojc, 2011; Zhao *et al.*, 2013). One of the first major 3D face models that hit the market was the Microsoft Agent which was introduced to help the users of Microsoft products. Microsoft Agent used simple 2D cartoon characters called Merlin, Peedy, Genie and Robby. They were simple speakable characters with a Speech API (SAPI) text to speech engine.

This research focuses on alignment of the lips with an input text or audio file. The generation of emotional 3D realistic talking face model offers more engagement of the users. This motivates one to create a system by improving the weight formula to get smooth movement of facial animation parameters (FAPs) for the lip region. Then, a new lip syncing method is proposed that aligns lips movements with the input text or audio file followed by integrating emotion and eye expression to the 3D face model to acquire realism. In this chapter a rationale of the research is developed and an attempt is made to argue why extensive investigation in the cited thesis topic is absolutely indispensable. In addition, the problem statement, objectives, scope of studies, contribution, research significance and a brief thesis organization are underscored.

### 1.2 Problem Background

Over the last few years, Virtual Worlds (VWs) particularly 3D graphics contents have advanced significantly. Technological advances in the hardware and software sectors have resulted in tremendous advancement in the technology including animation, display, graphics, distribution network, and mobile communications. Such progress has allowed nearly all users to have access to different tools and applications for the virtual worlds. Creating a 3D face model requires the contribution of several skills for the precise integration of lip syncing with eye gaze and facial expression. Figure 1.2 displays several important facial features that exemplify much of the verbal and non-verbal information required for such combination (Zhang *et al.*, 2010).



**Figure 1.2** Synthesized facial expressions based on talking 3D face model (Zhang *et al.*, 2010)

Queiroz *et al.* (2009) introduced a technique to develop a working, extendable, and stable facial animation platform that can easily animate the MPEG-4 parameterized faces. This work uses sophisticated parameters to describe the face actions and properties by rendering interactive platform between user and 3D face model. However, the limitation of this research is in the use of restricted parameters in the face. Bailly *et al.* (2010) acknowledged the process of creating interesting 3D face model by examining audio-visual opposite communication between human to

human and a human to virtual conversational agent. The central aim was to configure the mutual gaze patterns in the interaction using innovative instruments. Some measures of the effects of thinking states on communication functioning are demonstrated. A limitation of this work is the weak reproduction of the face deformations around the eyes of the Embodied Conversation Agents (ECA) during eye gaze deviation from the direction of head.

According to Balci *et al.* (2007), it is easy to extend research on virtual face by using Xface Open Source Project and SMIL-Agent Scripting Language. Figure 1.3 illustrates the creation of animated 3D face model. MPEG-4 cannot render an animated language but only a set of low- and high-level considerations. Though Xface is a dominant system in face animation it further needs higher levels abstraction, time control and incident organization. Another limitation of Xface is the non-implementation of various Facial Animation Parameters (FAPs), (such as the FAPs 14, 15, 23-30, 35, 36, 39-47). Therefore, this research implemented more FAPs than was implemented in Xface to give a more realistic motion and smooth blending.

Lee et al. (2010) developed realistic expressive 3D face model of real human. This was implemented to analyse the efficiency of expressive model. This method did not take into account in the pilot study human emotion recognition during temporal changes and or verbal clues. Gillies et al. (2010) introduced a real-time multimodal interaction to the 3D face model animation system in virtual reality situation. Shapiro (2011) achieved a high level of realism and control by describing a system for virtual characters motions, where a set of significant features of simulated character models and games are included. Xu et al. (2013) improved the work of Shapiro in practical terms by demonstrating a lip syncing method without addressing the issue of emotional content during speech. Čereković et al. (2010) applied preprocessed sets of realized behaviours to virtual character modules using Backpropagation Neural Network (BNN). This work was further improved by Čereković and Pandžić (2011) by innovating multi-platform Real Actor animation system for realizing real-time behaviour of Embodied Conversational Agents (ECA). The work relied on a solution for gestures and speech synchronization using neural networks.

Leuskia *et al.* (2014) demonstrated 3D face model assisted portable private health-care system, which is a model interface for user-level medical diagnoses gadgets with various subjects.

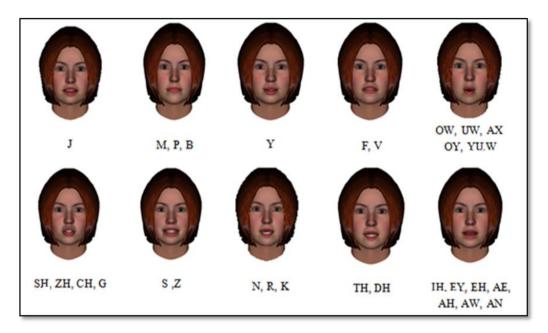
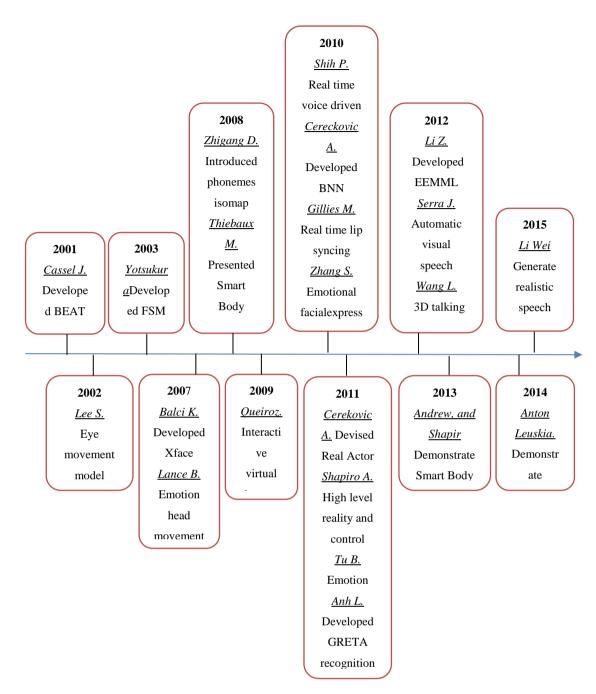


Figure 1.3 Visual phoneme (Balci *et al.*, 2007)

It is established that the lip syncing is the essential component in human interaction. It plays a key role in practical conversation between humans and 3D face model. The coherence in expressive face appearance is significant to enhance the realism of the 3D face model. The voice conveys much emotional information and the dialogue reveals a sequence of phones, where each phone is connected with an ocular depiction of the phoneme viseme. The animated visemes in a given phoneme are related to the pose of lip, jaw and tongue location. These methods are fashionable for creating real-time speech animation system including personality and interactive emotions. Shih *et al.* (2010) designed a mobile device for real-time voice driven lip shape character generation system that synchronizes the lip shape with the corresponding speech with the exception of emotion and eye movements.

Making an accurate synchronization with the event expected for normal behaviour is the main challenge in designing real-time voice driven lip shape character generation system. Li Zheng and Mao (2011) proposed an Emotional Eye Movement Markup Language (EEMML) as a script instrument. This aids in designing eye movements in face to face conversation that describes non-verbal interactions and intention of emotions. Based on lively talking, a real-time pragmatic talking animation is created by decomposing lower face movements and ending with applying motion blending. The issue of this work is a very high missing rate because it used a limited size of the captured dataset (Wei and Deng, 2015).

To achieve a realistic 3D face model, the combination of eye gaze, lip shapes, and expressions should be taken into consideration (Zhang *et al.*, 2010; Shapiro, 2011). The lip motions and voice should be synchronized to give realistic lip synchronization animation. To obtain the abilities used in spoken dialog, higher-level synchronization between two modules is necessary (Wei and Deng, 2015). Major systems use text-to-speech engine (TTS) activated visemes sets (Chuensaichol *et al.*, 2011; Xu *et al.*, 2013), where TTS engine converts a text format sound into a series of phonemes (Tao *et al.*, 2011; Xu *et al.*, 2011). This procedure is used to create a pragmatic speech animation without having to manually set the positions for visemes sets (Lee *et al.*, 1995). Serra *et al.* (2012) developed a visual dialogue simulation module in an attempt to accelerate and assess the quality of phonemes to viseme mappings device for English. Figure 1.4 summarizes chronologically some of the relevant researches focusing on eyes, lips, and facial expressions.



**Figure 1.4** Previous researches concerning 3D face models, facial expressions, and eye movements.

In summarizing these works, it is concluded that 3D face models carry remarkable information about an individual. It is evident from the wide range of applications of 3D model. Indeed, this is the motivating factor to choose a 3D face model as the research domain. Actually, facial animation is a wide research area focusing on very important aspects of combination between eye behaviours, emotional facial expression, and lip syncing according to the input text with optimal real-time interaction.

#### 1.3 Problem Statement

Despite continuous research progression and model development the animation of realistic facial appearances remains a critical challenge (Yu et al., 2014). The most sophisticated component in the face is the lip movements (Fratarcangeli, 2013). As mentioned above, this is mainly due to depiction of emotions which is a vital course of action in human intellect (Ichim, 2015). Therefore, it is imperative to produce 3D face model in terms of practical utterances with correct lip synchronized face animation involving close-to-nature lip movements and to integrate face expressions with eye movements to improve the realism of the 3D model (Kang et al., 2015). The emerging issues can be stated as follows based on the problem background and research questions:

- 1. The motion parameters of 3D face model have been the focal issue of generating an efficient 3D model in computer graphics for a few decades. Much effort has been put into creating models that can heighten the believability of animated models in social science, yet this issue has not been solved (Pasquariello and Pelachaud, 2002; Tao and Tan, 2004; Balci, 2007; Paul, 2010; Shapiro, 2011; Leone *et al.*, 2012) (Cai *et al.*, 2010) (Lee *et al.*, 2011).
- 2. Inaccurate alignment in lip syncing is an important issue that must be addressed. Lip shapes for many phonemes are modified based on phoneme. Although previous efforts focused on lip syncing, this issue has not been solved yet (Queiroz et al., 2009; Lee et al., 2011; Serra et al., 2012; Taylor et al., 2012; Leuski and Richmond, 2014; Wei and Deng, 2015).
- 3. Realistic 3D model issue is insufficient in facial animation area. Inspection of the eye movements with expressions to the 3D face model will increase the realism (Bailly *et al.*, 2010; Fagel and Bailly, 2011). Previous efforts (Lee *et al.*, 2010; Moussa *et al.*, 2010; Tinwell *et al.*, 2011; Mlakar and Rojc, 2011; Pelachaud, 2011; Ibbotson and Krekelberg, 2011; D'Mello *et al.*, 2012; Zhao *et al.*, 2012; Sun *et al.*, 2014) offered a series of eye behaviours, which are combined with diverse emotions, but also have not solved the realism issue.

#### 1.4 Research Aim

The aim of this research is to improve the motions of the parameters in the lip regions and to propose a new lip syncing method that aligns the text or audio file with the lip movements of the 3D face model and to improve the realism of the proposed 3D face model by integrating facial expression and eye behaviours.

## 1.5 Research Objectives

To achieve the aim, the following objectives need to be followed:

- 1. To formulate the motion parameters of the lip region to get believable 3D face model.
- 2. To propose a new lip syncing method for aligning the lip movements with the input text or audio file.
- 3. To integrate facial expressions and eye behaviours with 3D face model to improve the realism of the 3D face model.

### 1.6 Research Scope

To accomplish the proposed research objectives, the following research scopes are set:

- 1. MPEG-4 facial animation approach is used to animate the feature points in the 3D face model.
- 2. The proposed lip syncing method used 15 phonemes of English Language.
- 3. EEMML is used to implement the eye movements and combine with the proposed 3D model by SMIL language.

### 1.7 Significance of the Study

The virtual reality 3D face model provides accurate interaction between users and the applications of the 3D face model. Users need to stimulate more in the communication domain so that the synchronization between users and 3D face model allows more realistic, interesting, understandable, and interactive relationship. This thesis suggests a model which can be used to build facial animation engine and create an integrated model. This will create MPEG-4 animation automatically using facial action scripts with lip synchronization and eye movements even in the absence of key-framing meshes. In this model, interactive character actions can be defined via Some simple applications will be developed using combined exterior controls. computer vision algorithms to obtain communication between users and 3D model. This model following the MPEG-4 face animation standard will be able to illustrate a succession of various kinds of high-level facial action including talking, emotional expressions, and eye behaviour. These face actions being independent of each other will be processed using the proposed animation engine via different modules including lip harmonization and emotional face appearance. The main contribution would be the construction of a comprehensive animation system using open-ware resources. This will further integrate some popular simulation models that can create varieties of realistic face behaviour interactively or through a script based way with superior quality.

#### 1.8 Thesis Outline

This thesis consists of six chapters. Chapter 2 provides a thumb nail sketch of the recent relevant literatures. Some of the exhaustively reviewed topics are facial animation, facial animation techniques, lip syncing, vocal and structural properties of English language, realistic 3D face model consist of emotion modelling, facial expression, and eye behaviour, current 3D face model systems and vital analysis on realistic expressive 3D face model systems.

Chapter 3 describes the detailed research methodology. It highlights the proposed model including research framework, stages of research methodology, literature review and problem definition, system design and implementation, system motion and rendering, evaluation and operational framework. Chapter 4 describes the proposed methodology in detail with respect to formulating motion parameters of 3D face model, proposing new lip syncing method, improving the realism by integrating facial expressive synthesise and eyes movements method then synthesizing facial motion with MPEG-4 approach, interpolation and smoothing, employing interpolation and smoothing rendering and SMIL scripting language.

Chapter 5 describes the experimental results based on the newly formulated model. The implementation and benchmarking of the model are also highlighted. This chapter renders experimental setting, details of the conducted performance evaluations, and the implementation results of analysis of the facial model, the result of lip syncing method, the result of integration, animation results, evaluation of the experimental results, real benchmark, objective evaluation, and analysis of the displacements of motion parameters.

Chapter 6 concludes the thesis with future outlook. The successful fulfilment of all the proposed research objectives and the remaining unresolved issues are systematically discussed. The major contributions are also emphasized.

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