

深度學習研究成果分享

陳敦裕 教授/系主任
元智大學 電機工程系

簡歷

- 學歷

臺灣交通大學，資訊工程系，博士 (2004.06)

- 經歷

中央研究院資訊科學研究所，博士後研究員 (國防役
2005.02 -2009.01)

元智大學 電機工程系，助理教授 (2009.02 -2013.01)

元智大學 電機工程系，副教授(2013.02 -2016.01)

元智大學 電機工程系，教授 (2016.02 -至今)

元智大學 電機工程系，系主任 (2015.08 -至今)

元智大學電機系－人工智慧團隊



林志民
講座教授/
副校長
(IEEE Fellow)



陳敦裕
教授/系主任



方士豪 教授



施皇嘉
副教授



蘇泰元
助理教授



林仁俊
助理教授



深度學習研究成果

圖像識別

電力系統分析

室內定位

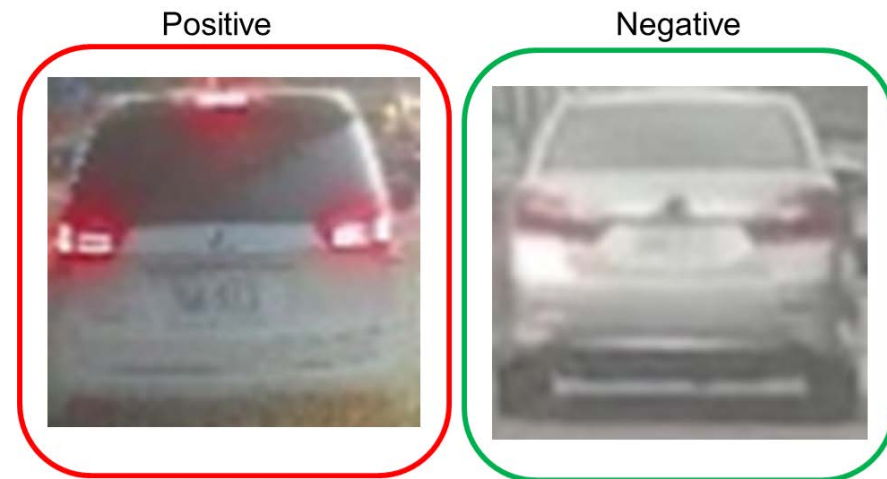
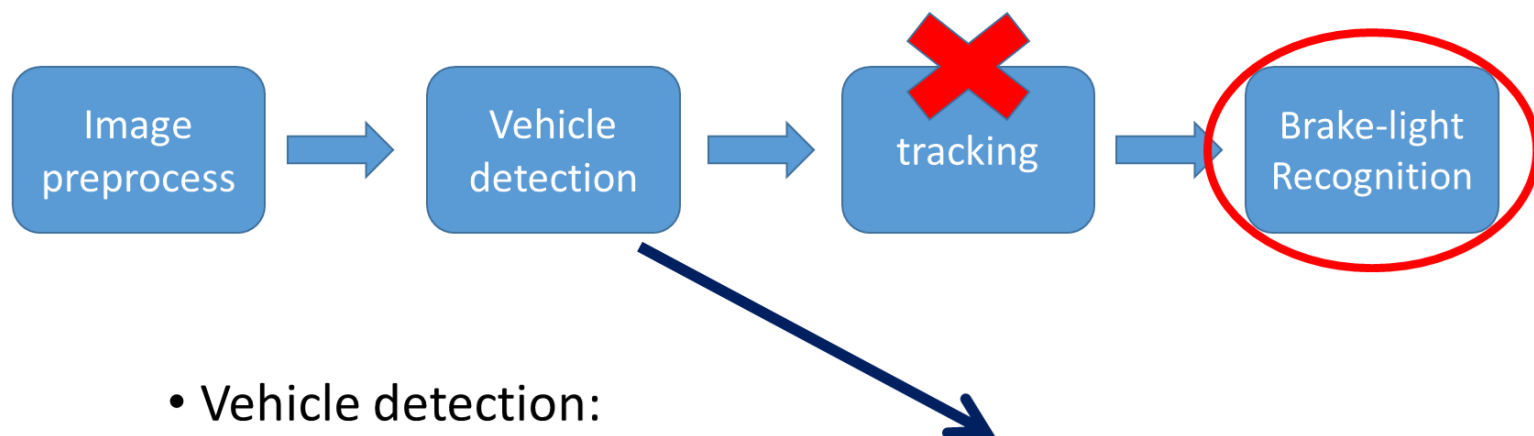
行為分析

醫學診斷應用

音訊及視訊融合

圖像識別 – 智慧交通應用

- Deep Vehicle Brake-Light Detection ▶



- Vehicle detection:

One stage: SSD 、YOLO 、FPN 、 **RetinaNet**

Two stage: R-CNN 、FAST-RCNN 、FASTER-RCNN

- Brake-light Recognition:

AlexNet 、VGG 、ResNet 、 **Densenet**

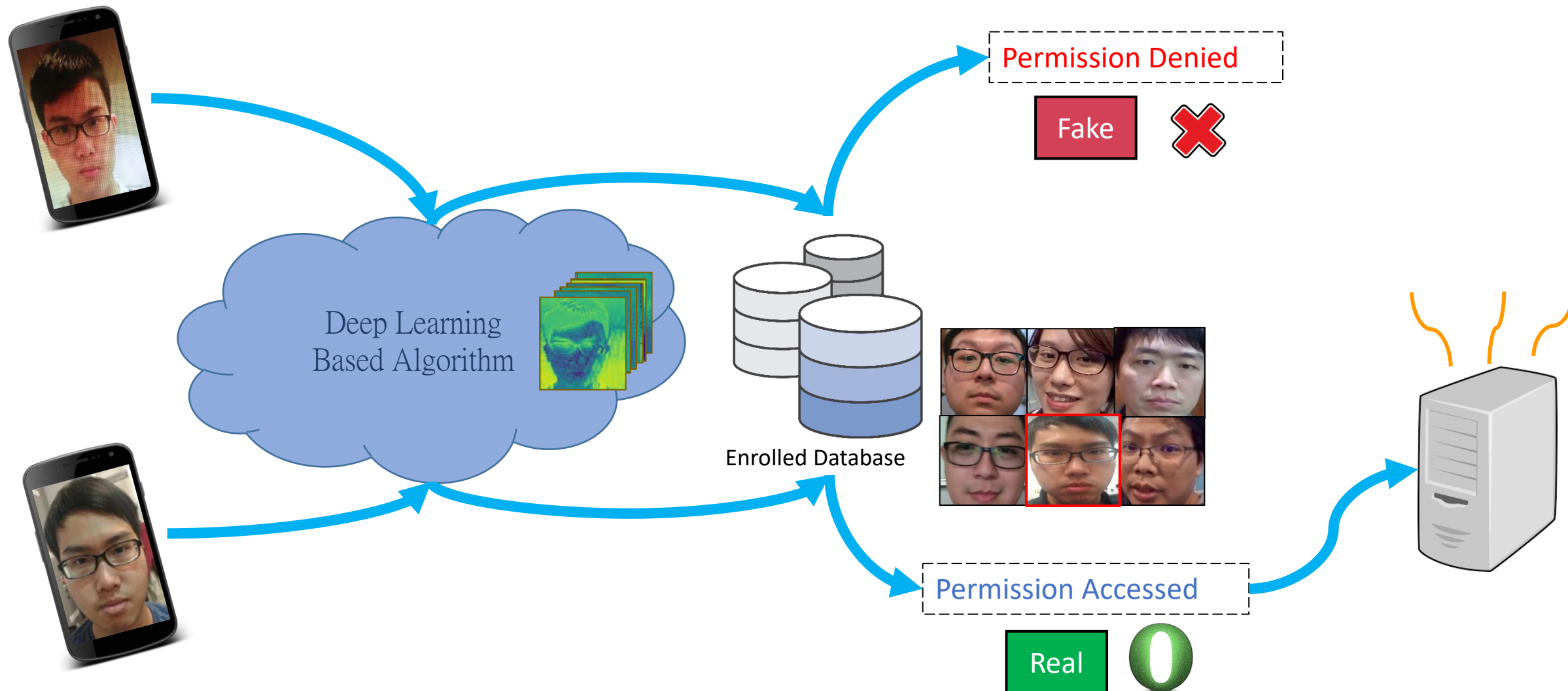
optical flow 、C3D 、LSTM



Duan-Yu Chen, Yu-Hao Lin and Yang-Jie Peng, "Nighttime Brake-Light Detection by Nakagami Imaging," *IEEE Transactions on Intelligent Transportation Systems*, Vol. 13, No. 4, pp. 1627-1637, Dec. 2012.

Duan-Yu Chen and Jhi-Yang Lin, "Deep Vehicle Brake-Light Detection," *IEEE Sensors Journal*, 2018. (submitted)

圖像識別 - 活體檢測 (Anti-spoofing)

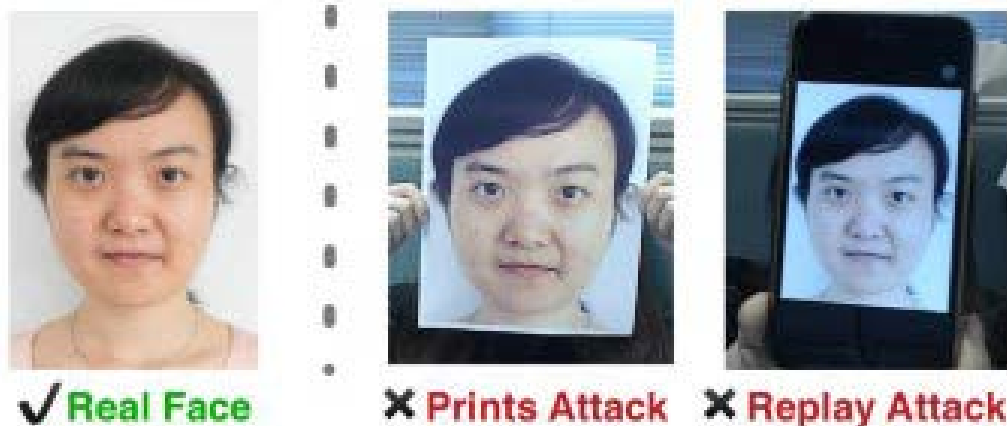


人臉識別目前主要攻擊手段

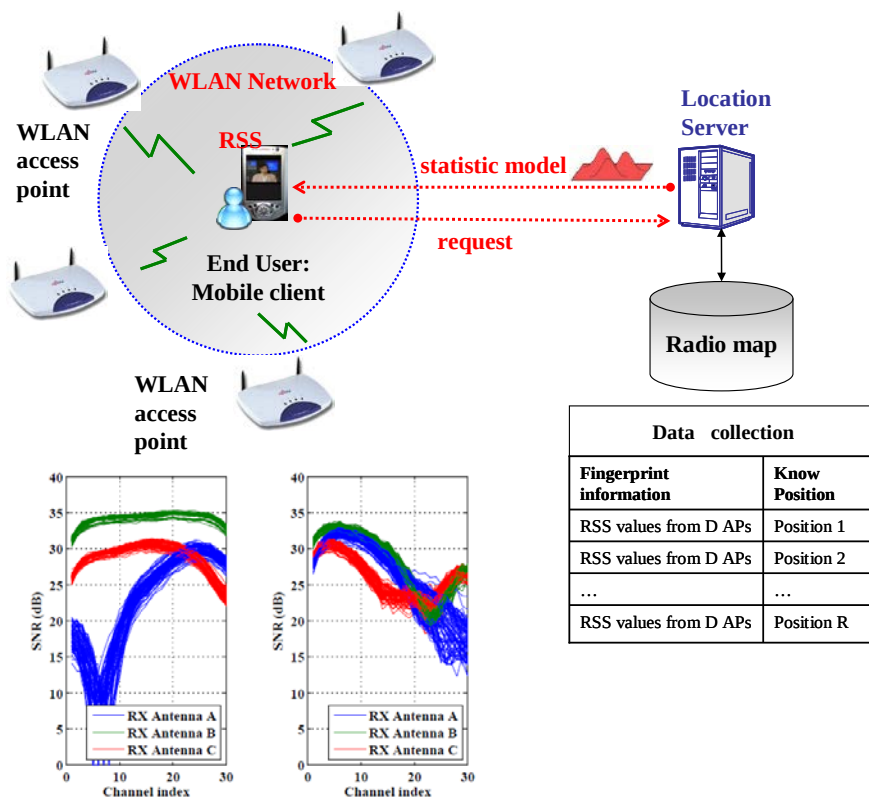
- Prints Attack ▶
- Replay Attack ▶
- Mask Attack ▶



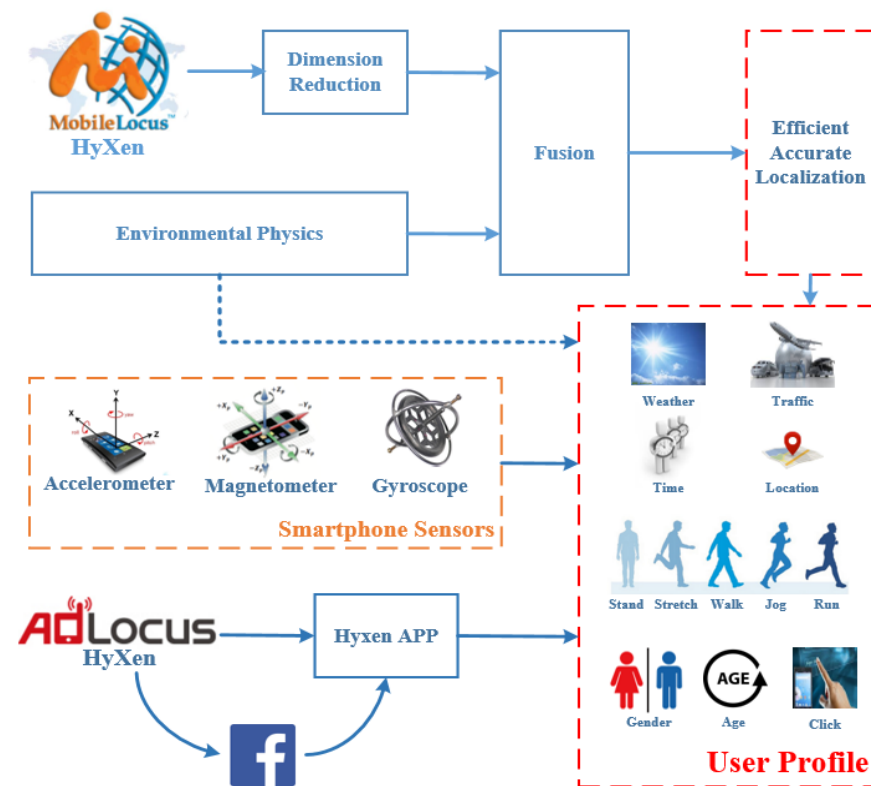
Real Person 2D Picture Wrong



智能手機感測訊號 - 室內定位



- [1] Shih-Hau Fang and Chu-Shuan Wang, "A Novel Fused Positioning Feature for Handling Heterogeneous Hardware Problem," *IEEE Transactions on Communications*, vol. 63, no. 7 pp. 2713-2723, 2015.
- [2] Shih-Hau Fang, Chu-Shuan Wang, and Y. Tsao, "Compensating for Orientation Mismatch in Robust WiFi Localization Using Histogram Equalization," *IEEE Transactions on Vehicular Technology*, vol. 64, no. 11, pp. 5210-5220, Nov. 2015.



- [3] Shih-Hau Fang, Wei-Hsiang Chang, Yu Tsao, Huang-Chia Shih, Chiapin Wang, "Channel State Reconstruction Using Multilevel Discrete Wavelet Transform for Improved Fingerprinting-Based Indoor Localization," *IEEE Sensors Journal*, vol. 16, no. 21, pp. 7784-7791, Nov. 2016
- [4] Chiapin Wang, Shih-Hau Fang, Hsiao-Chun Wu, Sheng-Min Chiou, Wen-Hsing Kuo, Po-Chiang Lin, "Novel User-Placement Ushering Mechanism to Improve Quality-of-Service for Femtocell Networks," to appear in *IEEE Systems Journal*, 2017

國際室內定位競賽@日本北海道大學

New Award: Rank 3 in IPIN 2017 (YAI team)

Publication with Spain, Portugal, Chile, Germany



Article

Off-Line Evaluation of Mobile-Centric Indoor Positioning Systems: The Experiences from the 2017 IPIN Competition

Joaquín Torres-Sospedra ^{1,*}, Antonio R. Jiménez ², Adriano Moreira ^{3,*}, Tomás Lungenstrass ^{4,*}, Wei-Chung Lu ⁵, Stefan Knauth ^{6,*}, Germán Martín Mendoza-Silva ¹, Fernando Seco ², Antoni Pérez-Navarro ⁷, Maria João Nicolau ³, António Costa ³, Filipe Meneses ⁸, Joaquín Farina ⁴, Juan Pablo Morales ⁴, Wen-Chen Lu ⁵, Ho-Ti Cheng ⁵, Shi-Shen Yang ⁹, Shih-Hau Fang ^{5,*}, Ying-Ren Chien ^{9,*} and Yu Tsao ¹⁰

¹ Institute of New Imaging Technologies, Universitat Jaume I, 12071 Castelló, Spain; gmendoza@uji.es

² Centre for Automation and Robotics (CAR), CSIC-UPM, 28500 Arganda del Rey, Spain; antonio.jimenez@csic.es (A.R.J.); fernando.seco@car.upm-csic.es (F.S.)

³ Algoritmi Research Centre, University of Minho, 4800-058 Guimarães, Portugal; maria.j.nicolau@algoritmi.uminho.pt (M.J.N.); antonio.costa@algoritmi.uminho.pt (A.C.)

⁴ AraraDS, Monseñor Sotero Sanz 161, Santiago, Chile; joaquin@ararads.com (J.F.); juanpablo@ararads.com (J.P.M.)

⁵ Department of Electrical Engineering, Yuan Ze University, Zhongli, Taiwan; dennis70413@gmail.com (W.-C.L.); s1054605@mail.yzu.edu.tw (W.-C.L.); s1054601@mail.yzu.edu.tw (H.-T.C.)

⁶ Faculty for Geomatics, Computer Science and Mathematics, HFT Stuttgart—University of Applied Sciences, 70174 Stuttgart, Germany

⁷ Universitat Oberta de Catalunya, Rambla del Poblenou 156, 08018 Barcelona, Spain; aperezn@uoc.edu

⁸ Centro de Computação Gráfica (CCG), 4800-058 Guimarães, Portugal; filipe.meneses@cgc.pt

⁹ Department of Electrical Engineering, National Ilan University, Yilan, Taiwan; shen49853@gmail.com

¹⁰ Research Center for Information Technology Innovation, Academia Sinica, Taipei, Taiwan;

智能手機感測訊號 - 行人交通模式分類

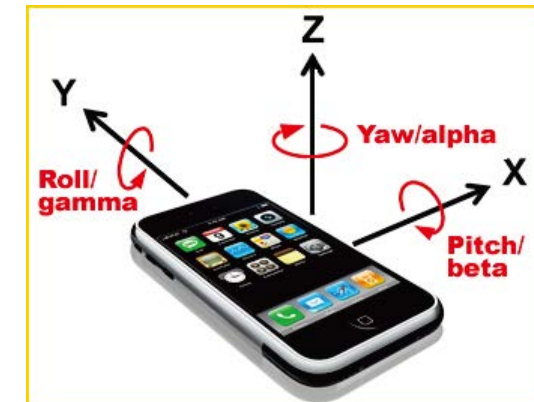
- 行人姿態與交通模式識別
 - IEEE BigMM 2016 HTC Challenge 第三名



Shih-Hau Fang, Hao-Hsiang Liao, Yu-Xiang Fei, Kai-Hsiang Chen, Jen-Wei Huang, Yu-Ding Lu and Yu Tsao, "Transportation Modes Classification Using Sensors on Smartphones," *Sensors*, vol. 16, issue 8, Aug. 2016

• HyXen_AdLocus

- 勝義科技
- 精準行銷
- 地理廣告投放



LBS廣告投放機制



區域型投放

適合區域型廣告投放，如：西門商圈、京站商圈、站前商圈等。



城市型投放

可選擇特定城市投放廣告，如：大台北地區活動可選擇台北市、新北市、基隆市投放廣告。



多點投放

較適合連鎖通路使用，可匯入商店地址，於店點附近投放廣告。

Shih-Hau Fang, Ying-Tso Hsu, Yao Shiao, and Fan-Yu Sung, "An Enhanced Device Localization Approach Using Mutual Signal Strength in Cellular Networks," *IEEE Internet of Things Journal*, vol. 2, no. 6, pp. 596-603, Dec. 2015.

聲學訊號 - 病理嗓音偵測與分類

[動機] 病理嗓音偵測與分類

- 嗓音問題由於聲帶位處喉部深處
- 非專科醫師與特殊儀器難以進行檢查

[資料] 聲學訊號偵測病理嗓音

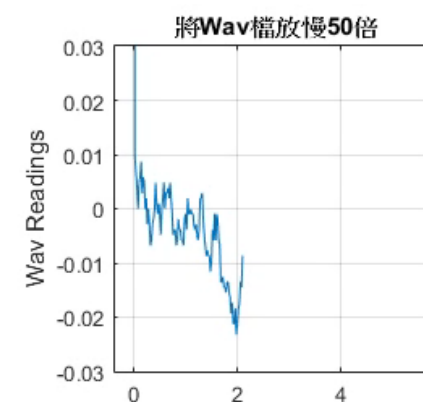
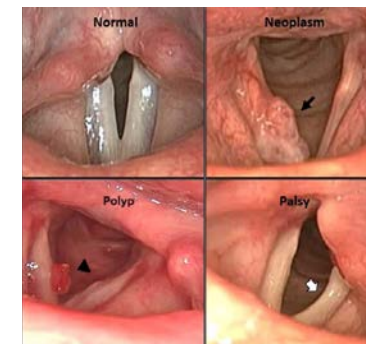
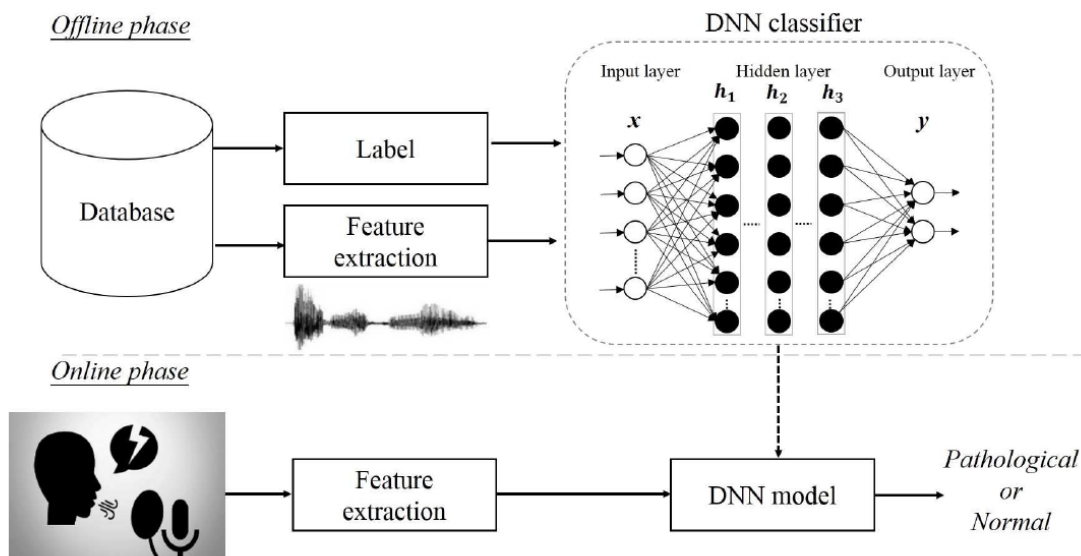
- 利用**母音阿數秒**/自然說話(固定講稿)之語音訊號/病史
- 八種病理嗓音

[效益]

- 輔助醫療資訊之判讀
- 高風險患者(如教師、業務、導遊、歌手) 於初期徵兆時及早介入
- 供醫療匱乏地區之遠端諮詢 (節省醫療資源，減少患者往返)

聲學訊號 - 病理嗓音偵測與分類 (cont.)

聲帶萎縮
聲帶癌症
聲帶發育不良
聲帶囊腫
聲帶結癭
聲帶息肉
聲帶顫動
聲帶溝及
聲帶麻痺

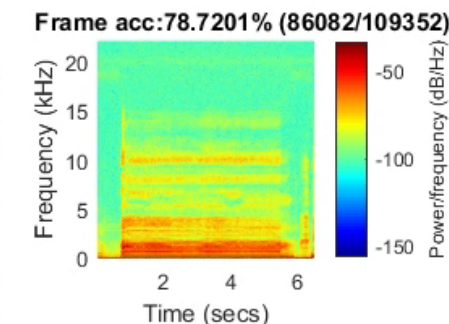
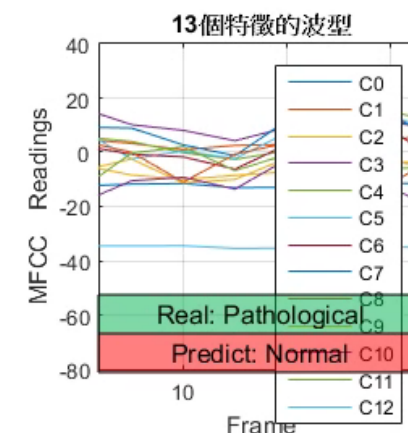


Detection of Pathological Voice



此領域第一個引入深度學習/人工智慧之團隊

- FEMH 亞洲唯一病理語音資料庫
- 獨特之華文語音
- MEEI 效能居全球領先地位
- 雛形系統展示



聲學訊號 - 病理嗓音偵測與分類 (cont.)

病理嗓音偵測研究成果

- 具臨床應用價值，應用於健康照護服務
- 亞東資料庫偵測率可達**94.26%(男)**、**90.52%(女)**
- 公開資料庫偵測率達**99.1% (MEEI, 美國馬薩諸塞州醫院)**

第一個引用深度學習於此領域之團隊

- [2018/02]中華民國專利獲證
- [2018/03] Detection of Pathological Voice Using Deep Learning, accepted by *Journal of Voice*

FEMH資料

- 目前唯一的華語文病理嗓音資料庫
- 全球個案數最多且標記最完整的病理語音資料庫

	Number		Mean age (years)		Age range (years)		Std. deviation (years)	
	♂	♀	♂	♀	♂	♀	♂	♀
Normal	16	44	30.69	30.08	23-37	22-47	3.93	5.79
Pathology	191	211	56.05	44.2	20-87	8-87	15.93	14.93

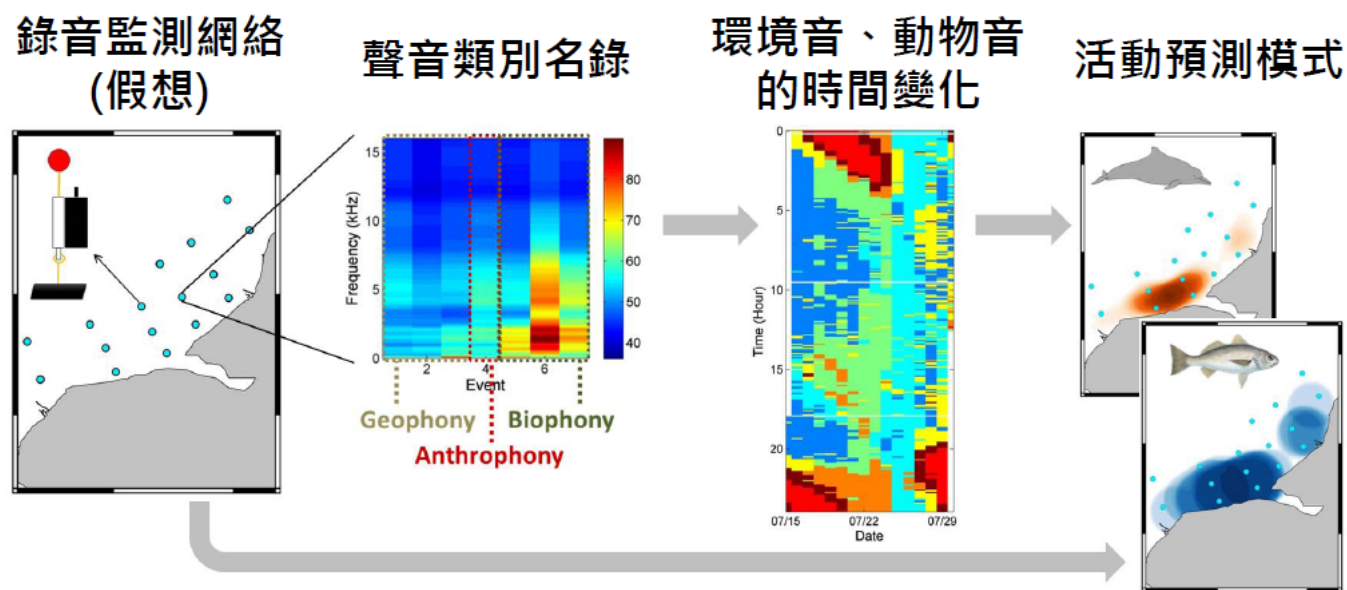
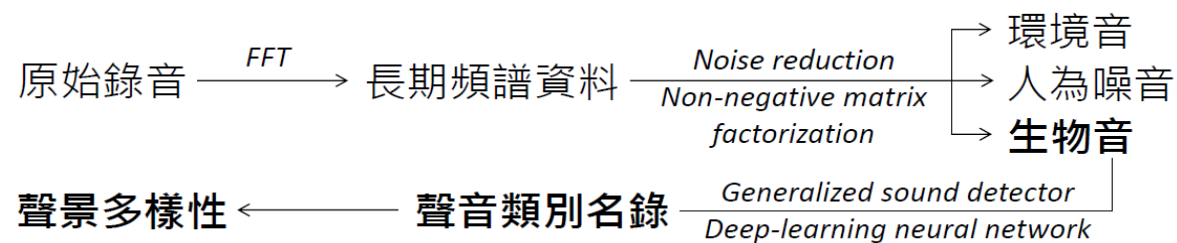
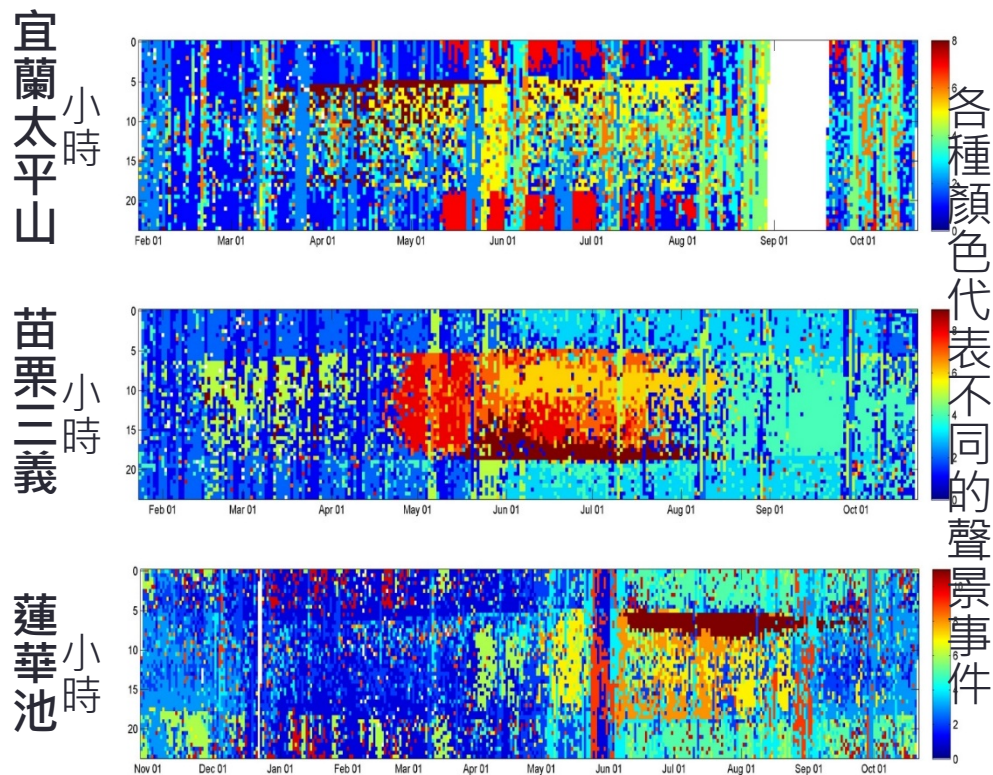
人數從最初研究時的462人 現已增加逾1000 (持續收錄中)

	病種							
	結節	息肉	囊腫	癌症	萎縮	震顫	麻痺	聲帶溝
男生	1	18	16	50	41	2	42	21
女生	51	32	34	7	16	17	26	28

提升鑑別力(2類=>3類=>....=>8類) 提升精確度 (70%=> 90%)
 提升強健性 (安靜錄音室/麥克風 => 自然室內環境/手機)
 提升擴充性 (母音阿 => 關鍵字 => 自然對話)

聲學訊號 - 聲景資訊分析生態環境

Tzu-Hao Lin, Shih-Hua Fang, and Yu Tsao, “Improving biodiversity assessment via unsupervised separation of biological sounds from long-duration recordings, *Scientific Reports*, 2017



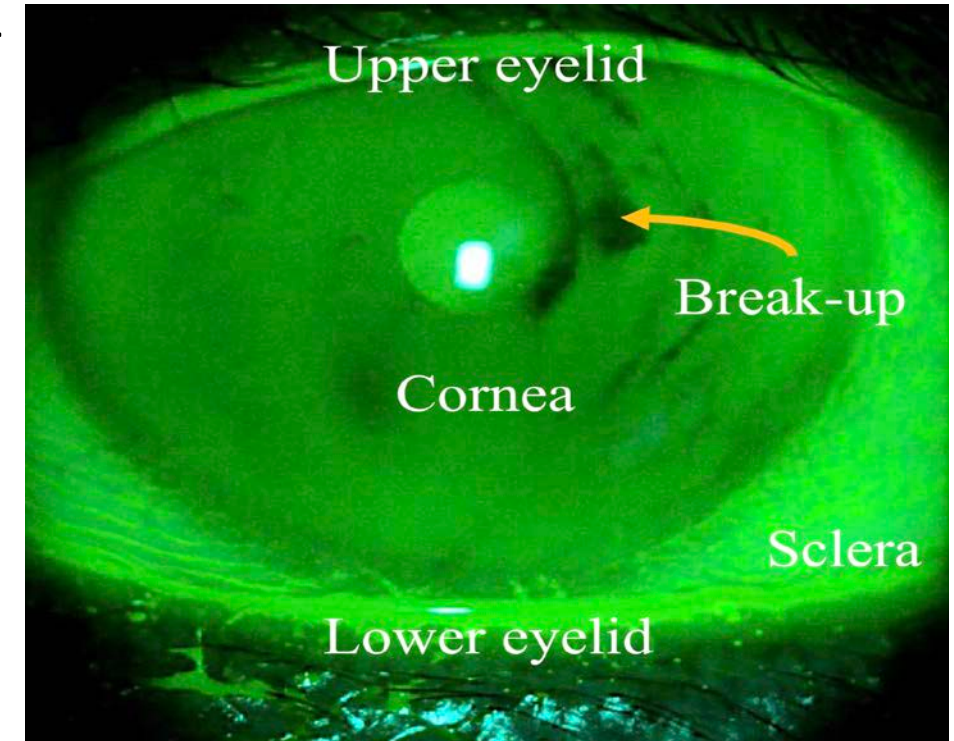
生醫影像－乾眼症診斷

- Dry eye syndrome is one of the most common eye diseases
 - Functional visual acuity
 - Quality of a patient's life
- Symptoms
 - Sandy-gritty irritation
 - Dryness
 - Blurred vision
- The tear film stability test : Fluorescent tear film break up time test



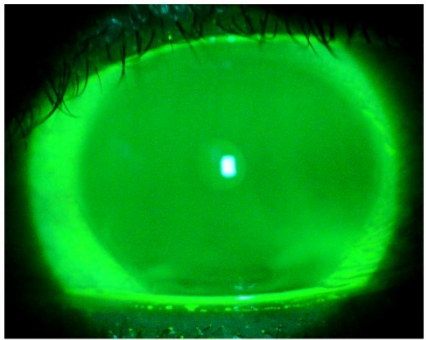
Fluorescent tear film break up time test (FTBUT)

- The FBUT test consists of measuring the time that the tear film remains stable without blinking
- Two microliter of 2% sodium **fluorescein** is instilled into the eye
- Tear film observed with the **cobalt light** source
- The patient is instructed to blink several times naturally
- The FTBUT is measured as the time elapsed between the last blink and the **first appearance** of a **dark spot** on the ocular surface.
- The appearance of the dark spot corresponds to the tear **film thickness**, which identifies the break-up of the tear film.
- An FTBUT shorter than **5 s** indicates low tear-film stability (Dry eye)

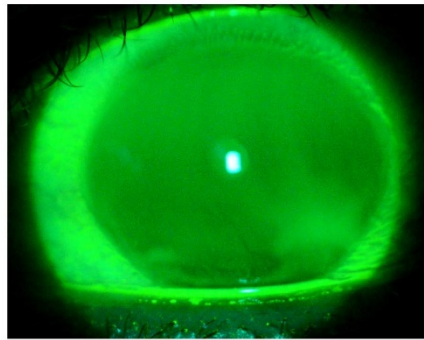


Disadvantage of FTBUT test

- FTBUT test is affected by low repeatability mainly due to a **subjective appreciation of the dark spots**. The **automation** of this test would reduce its subjective character.

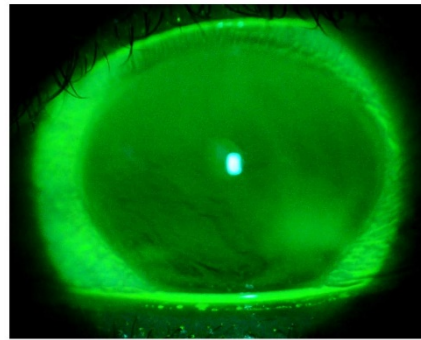


1 sec



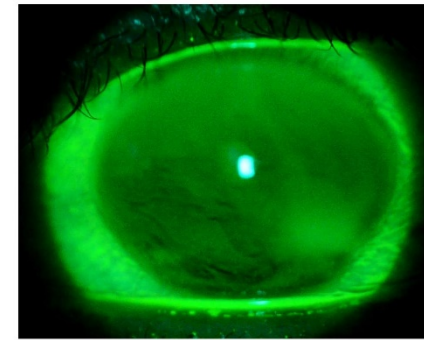
2 sec

Break-up yet?



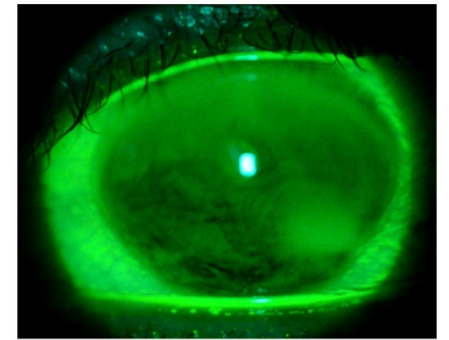
3 sec

Break-up yet?



4 sec

Break-up yet?



5 sec

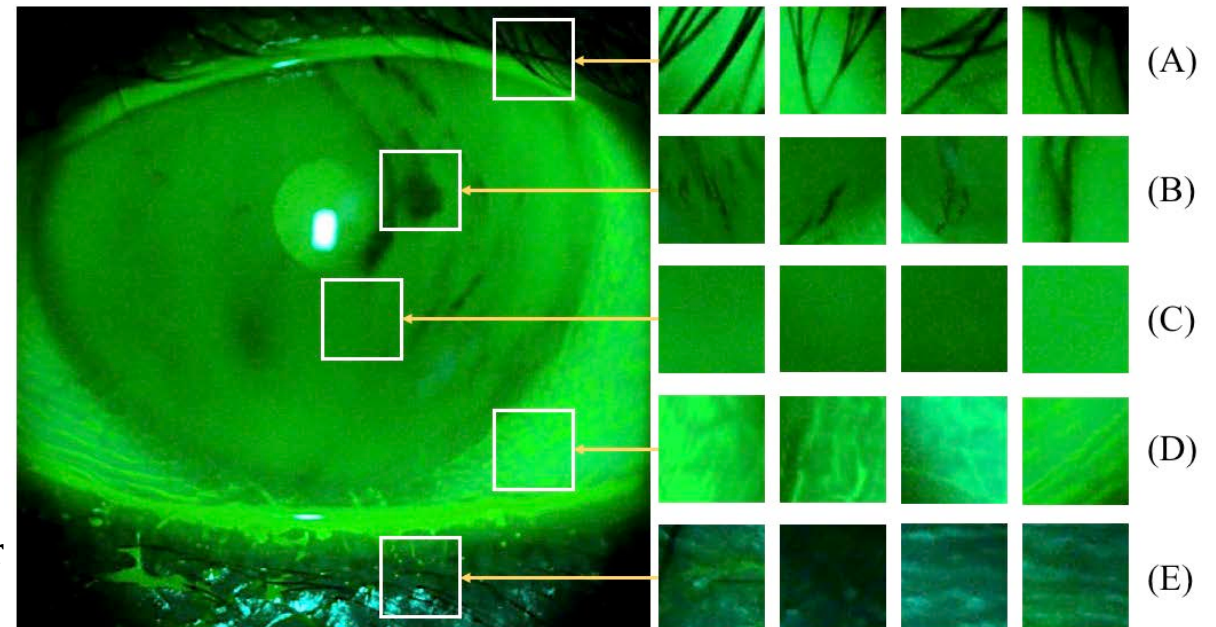
Preparing for Deep Learning

Features:

- (A) Eyelash
- (B) Tear film break-up area
- (C) Tear film non-break-up area
- (D) Sclera
- (E) Eyelid
- Size = 96 x 96 pixels

Table 2. Summary among training, validation and testing datasets for features of fluorescent tear film image.

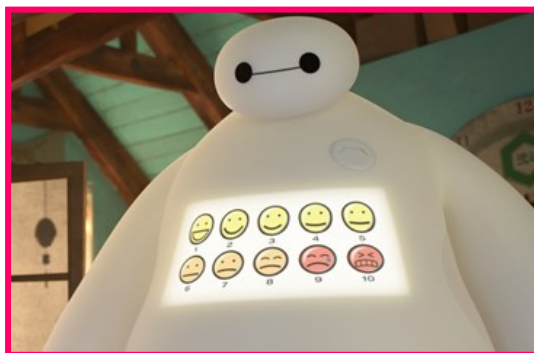
	Train	Val	Test	Total
Break-up	6367	707	786	7860
Non-break	2421	269	298	2988
Eyelash	4390	487	541	5418
Eyelid	5364	595	662	6621
Sclera	1685	187	208	2080



Tai-Yuan Su, Ze-Yuan Lu, Duan-Yn Chen, Shu-Wen Chang, “Tear film break-up time measurement using deep convolutional neural networks for screening dry eye disease,” *IEEE Sensors Journal*, 2018. (submitted)

音訊與視訊融合與整合之應用

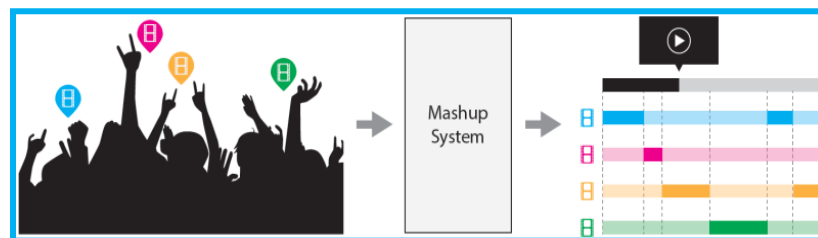
- Audio-Visual **Multimodal Data Fusion and Integration** for **Multimedia Applications**



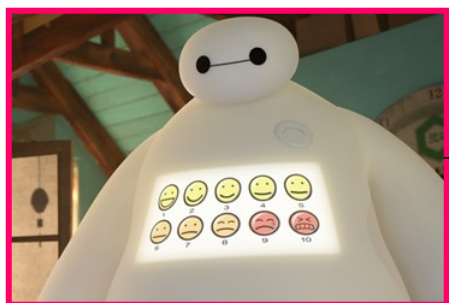
Emotion Recognition



Automatic Music Video Generation

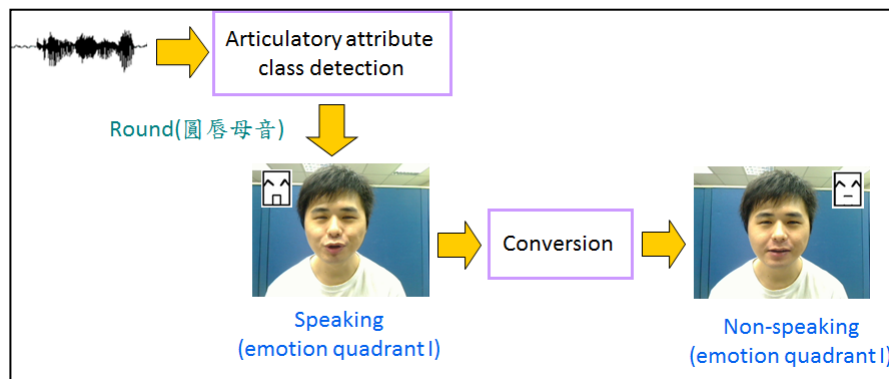


Automatic Concert Video Mashup

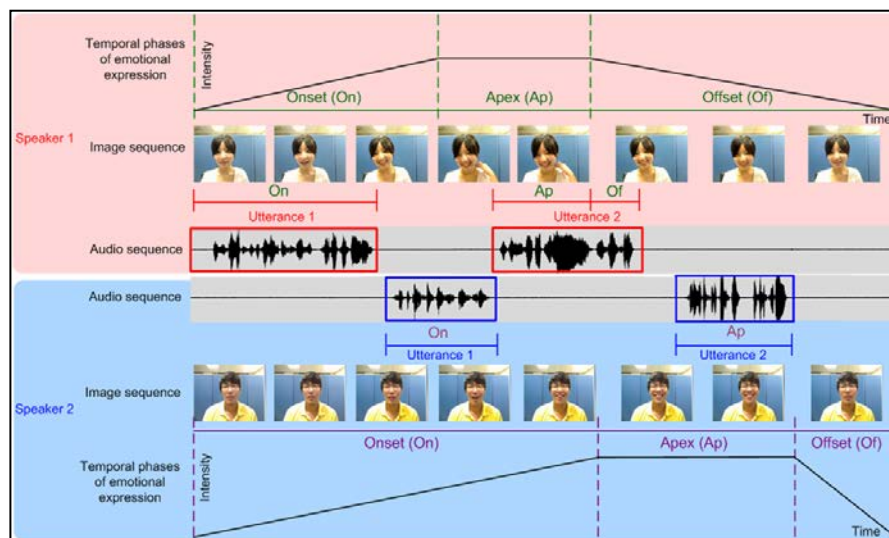


Emotion Recognition

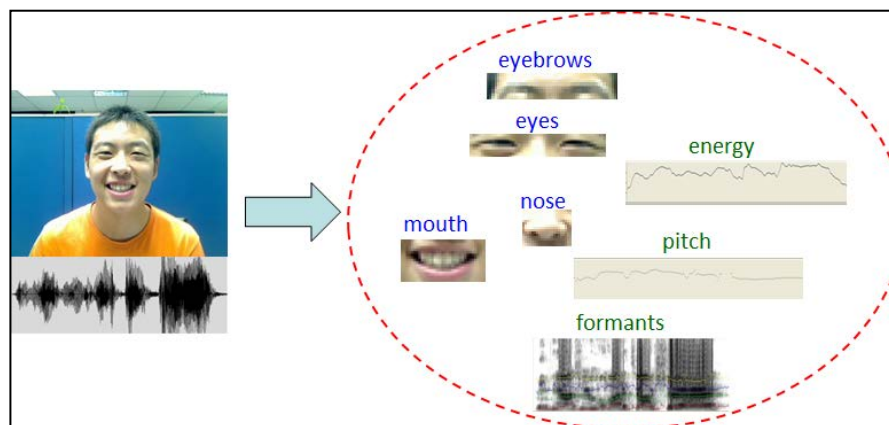
Facial Expression Recognition



Speech Emotion Recognition



Audio-visual Emotion Recognition



Laughter Detection

webcam_cv3 - loadCNN多人情緒辨識.py - C:\Python27\Webcam-Face-Det...

File Edit Format Run Options Window Help

Python 3.5.3 Shell

File Edit Shell Debug Options Window Help

```

import c
import s
import l
import d
from tim
import n

import k
from ker
from ker
from ker
from ker

cascPath
faceCasc
log.basi

video_ca
anterior

pixel=96
x_test=n

model =
# input:
# this a
model.ad
model.ad
model.ad
##model.

model.ad
model.ad
model.ad
##model.

##model.
##model.
##model.

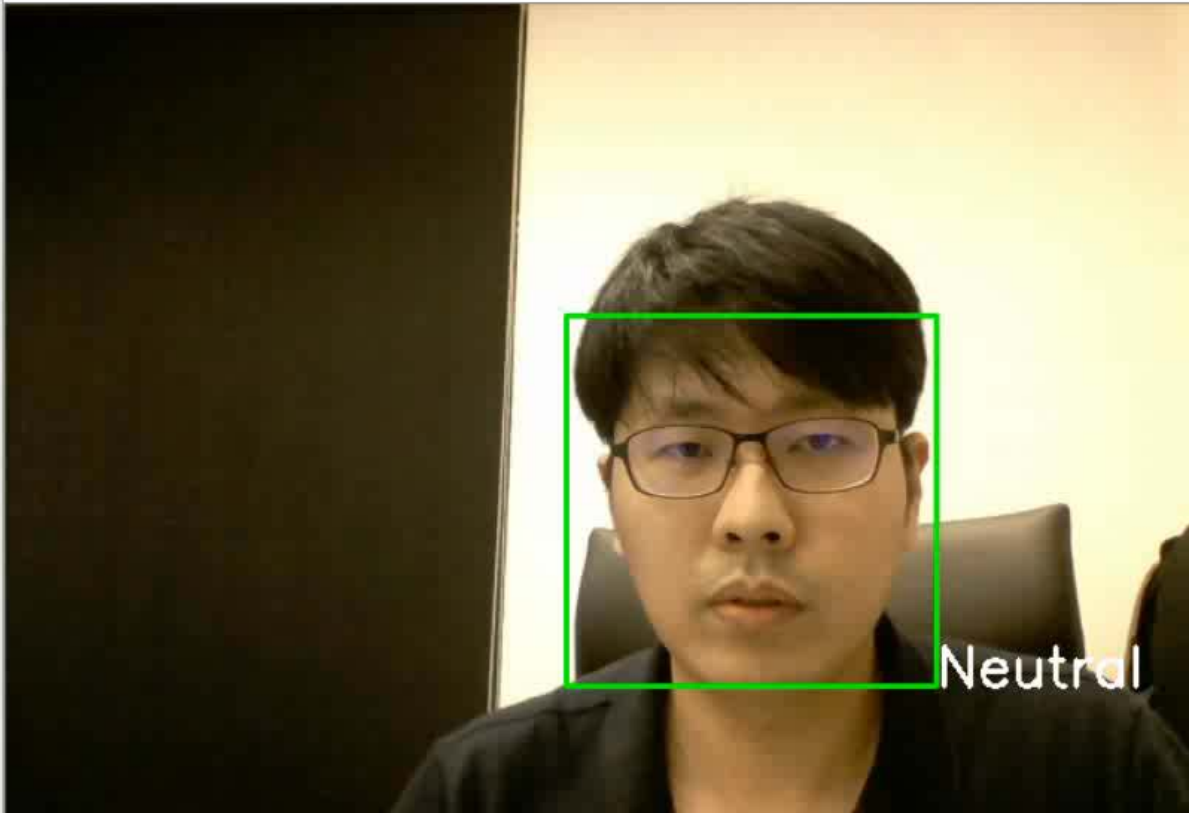
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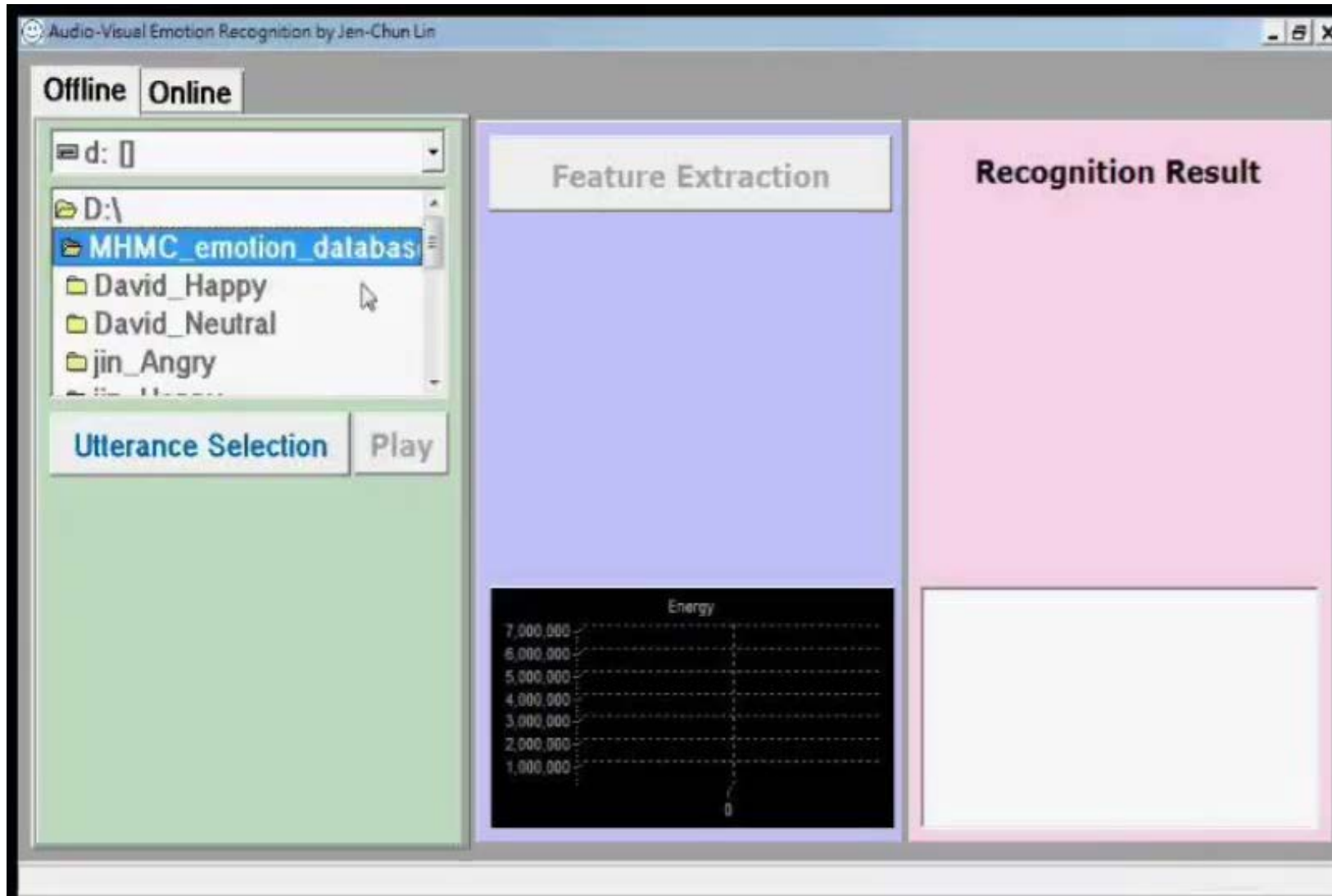
```

Video



Neutral

Audio-Visual Emotion Recognition



Publications (Emotion Recognition)

Journal

Total: 6

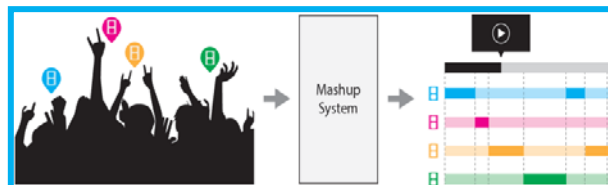
Source :	IEEE Trans. on Multimedia	(SCI)	2012, 2013, 2013
	IEEE Trans. on Audio, Speech and Language Processing	(SCI)	2014 (on the cover)
	IEEE Trans. on Affective Computing	(SCI)	2017
	APSIPA Trans. on Signal and Information Processing	(invited)	2014

International Conference

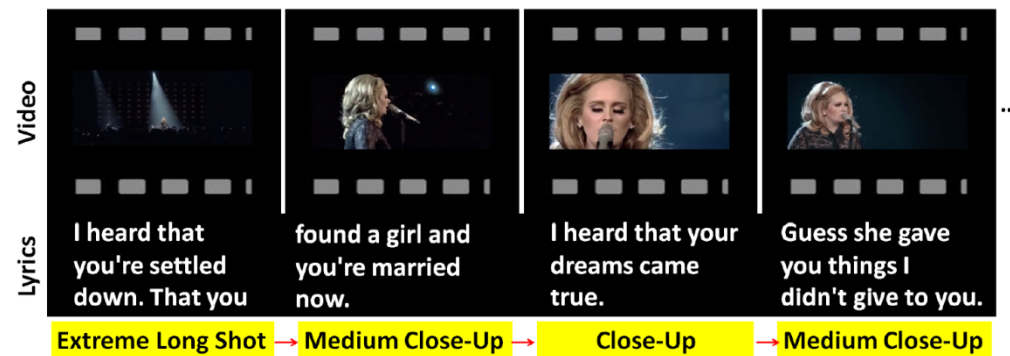
Total: 11

Source :	ICASSP	2013, 2013
	INTERSPEECH	2013
	APSIPA	2010, 2013, 2014
	ACII	2011, 2011
	ACII Workshop	2015 (is awarded with "Most Interesting Paper")
	ICOT	2013, 2014

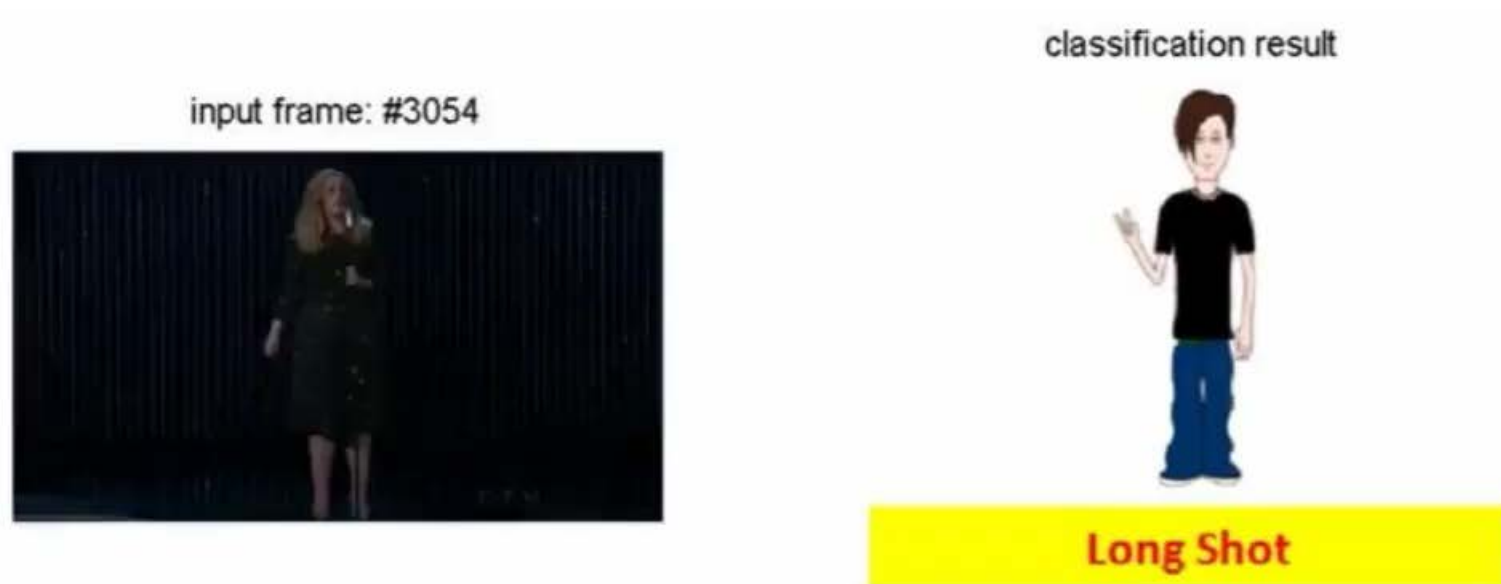
自動化演唱會視訊混搭 (Mashup)



Automatic Concert Video
Mashup



Demo



Demo - Mashup Result

mr#1

1280x720
25fps
00:05:22.6



mr#2

1280x720
25fps
00:03:43.5



mr#3

1280x720
25fps
00:09:02.9





mr#1

mr#2

mr#3



Publications (Automatic Concert Video Mashup)

Journal

Total: **1**

Source : IEEE Trans. on Multimedia (SCI) accepted 2018

International Conference

Total: **2**

Source :	ICME	2018
	ICASSP	2017

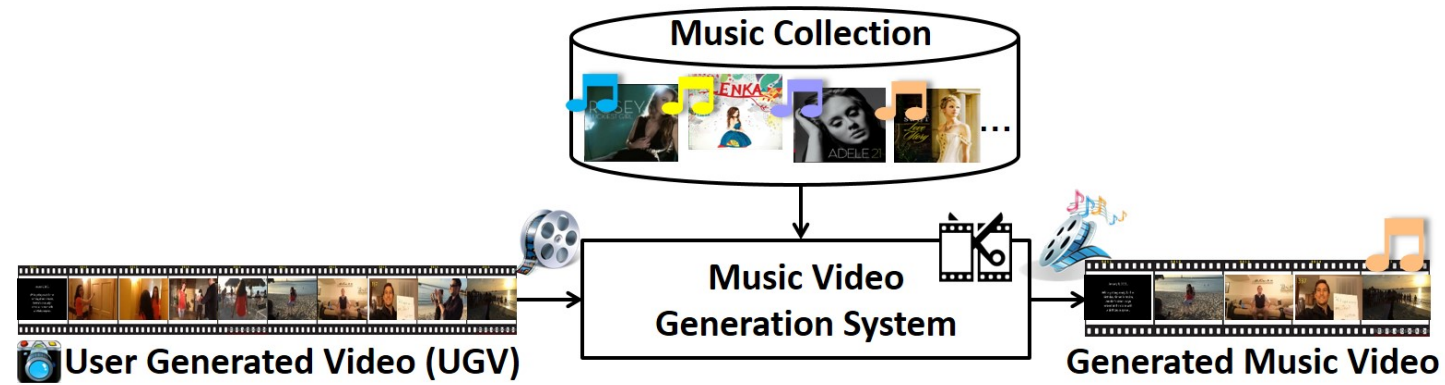
Domestic Conference

Total: **1**

Source : TANET (Best Paper Award) 2016

Automatic Music Video Generation

.....



DEMO



video length : 00:12:25



video length : 00:05:06

Publications (Automatic Music Video Generation)

International Conference

Total: 4

Source :	ACM Multimedia (Top Conference)	2015, 2016, 2017
	ICASSP	2016



Q & A

