#### Carnegie Mellon University











# First Grand-Challenge and Workshop on Human Multimodal Language (Challenge-HML)

#### Organizers:



Amir Louis-Philippe Zadeh Morency



Paul Pu Liang



Soujanya Poria



Erik Cambria



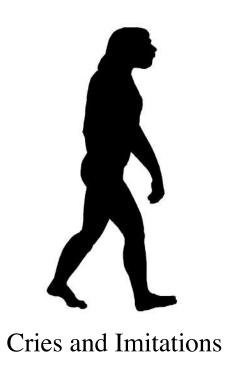
Stefan Scherer



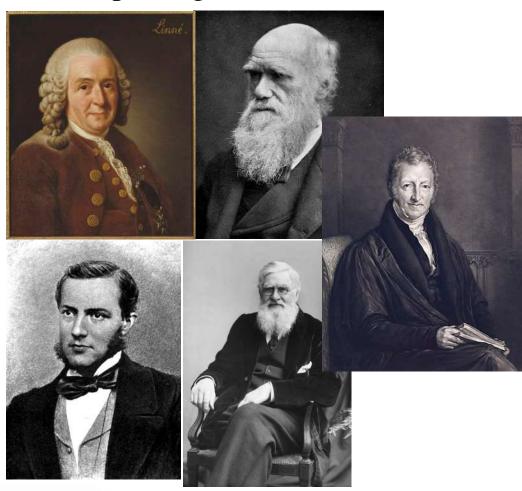
Zhun Liu

## Continuous Theories of (Multimodal) Language

Throughout evolution language and nonverbal behaviors developed together.







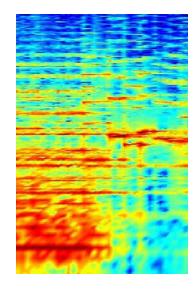
#### Multimodal Language Modalities

"I really like this vacuum cleaner, it was one of the few that has a large dust bag ..."

Language (words)







Acoustic (voice)

Carnegie Mellon University

#### Challenge-HML Structure

• Our goal in the first Challenge-HML is to build models of sentiment and emotions for human multimodal language through the proxy of in-the-wild speech videos.



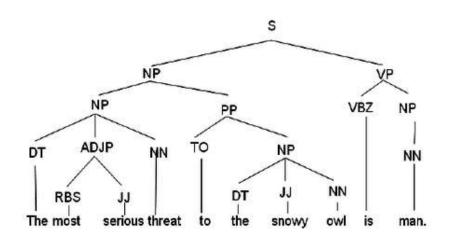
#### Challenge-HML Metrics

Sentiment: Binary and Multiclass Sentiment Analysis

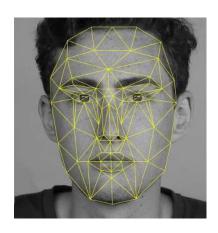
- Emotion Recognition: Binary and Multiclass Analysis of
  - Happiness
  - Sadness
  - Anger
  - Surprise
  - Disgust
  - Fear

## Difficulties in Modeling Multimodal Language

- Modeling
  - Intra-modal Dynamics: difficulties in modeling each modality.



Language (words)



Vision (gestures)



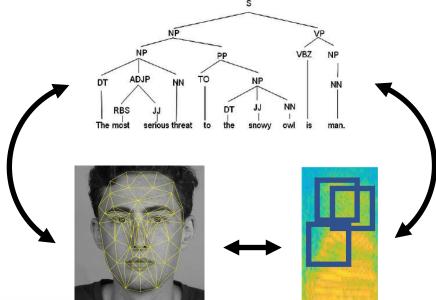
Acoustic (voice)

## Difficulties in Modeling Multimodal Language

- Modeling
  - Intra-modal Dynamics
    - Difficulties in modeling each modality

Inter-modal Dynamics (fusion): difficulties in modeling spatio-

temporal relations between modalities



## Difficulties in Modeling Multimodal Language

- Modeling
  - Intra-modal Dynamics
    - Difficulties in modeling each modality
  - Inter-modal Dynamics (fusion)
- Idiosyncratic signal
  - Speakers talk and behave differently



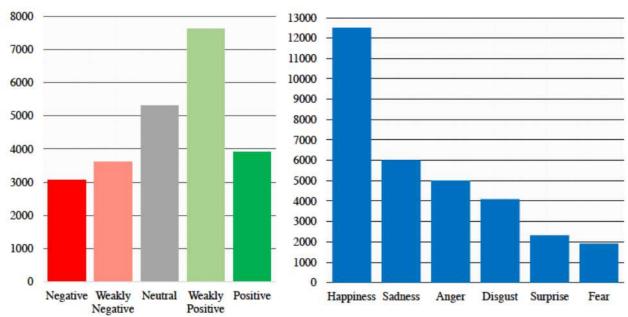
#### **CMU-MOSEI** Dataset

- CMU-Multimodal Sentiment and Emotion Intensity Analysis Dataset
  - Largest multimodal dataset of sentiment and emotion analysis.
  - More than 23,000 sentence utterances from YouTube.
  - More than 3,000 YouTube videos.
  - More than 1000 speakers.
  - More than 250 topics.
  - All three modalities.
  - Manual transcriptions.
  - Phoneme-level Alignment (semi-automatic)
  - Annotated for sentiment and emotions (Likert scales)
    - 7-scale sentiment (CMU-MOSI, SST)
    - 4-scale emotions (happiness, sadness, anger, disgust, surprise, fear)

#### **CMU-MOSEI** Dataset

Dataset	# S	# Sp	Mod	Sent	Emo	TL (hh:mm:ss)
CMU-MOSEI	23,453	1,000	$\{l, v, a\}$	1	1	65:53:36
CMU-MOSI	2,199	98	$\{l, v, a\}$	/	X	02:36:17
ICT-MMMO	340	200	$\{l, v, a\}$	/	X	13:58:29
YouTube	300	50	$\{l, v, a\}$	1	X	00:29:41
MOUD	400	101	$\{l, v, a\}$	/	X	00:59:00
SST	11,855	_	$\{l\}$	1	X	=
Cornell	2,000	-	$\{l\}$	/	X	_
Large Movie	25,000	-	$\{l\}$	1	X	_
STS	5,513	_	$\{l\}$	1	X	_
<b>IEMOCAP</b>	10,000	10	$\{l, v, a\}$	X	1	11:28:12
SAL	23	4	$\{v,a\}$	×	/	11:00:00
VAM	499	20	$\{v,a\}$	X	1	12:00:00
VAM-faces	1,867	20	$\{v\}$	X	/	_
HUMAINE	50	4	$\{v,a\}$	X	1	04:11:00
RECOLA	46	46	$\{v,a\}$	X	1	03:50:00
SEWA	538	408	$\{v,a\}$	X	/	04:39:00
<b>SEMAINE</b>	80	20	$\{v,a\}$	X	/	06:30:00
AFEW	1,645	330	$\{v,a\}$	X	1	02:28:03
AM-FED	242	242	$\{v\}$	X	1	03:20:25
Mimicry	48	48	$\{v,a\}$	X	/	11:00:00
AFEW-VA	600	240	$\{v,a\}$	X	1	00:40:00





#### Keynotes



Dr. Bing Liu University of Illinois at Chicago (USA)



Dr. Sharon Oviatt Monash University (Australia)



Dr. Roland Göcke University of Canberra (Australia)

## Thank you for joining us today