

Affective multimedia analysis: introduction, background and perspectives

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Outline

Initial ideas

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Initial idea

Picard, R. (1995). Affective computing. Technical Report 321, MIT Media Laboratory, MIT Media Laboratory: Perceptual Computing; 20 Ames St., Cambridge, MA 02139.

There were similar ideas prior to this paper, e.g., Kensai Eng.

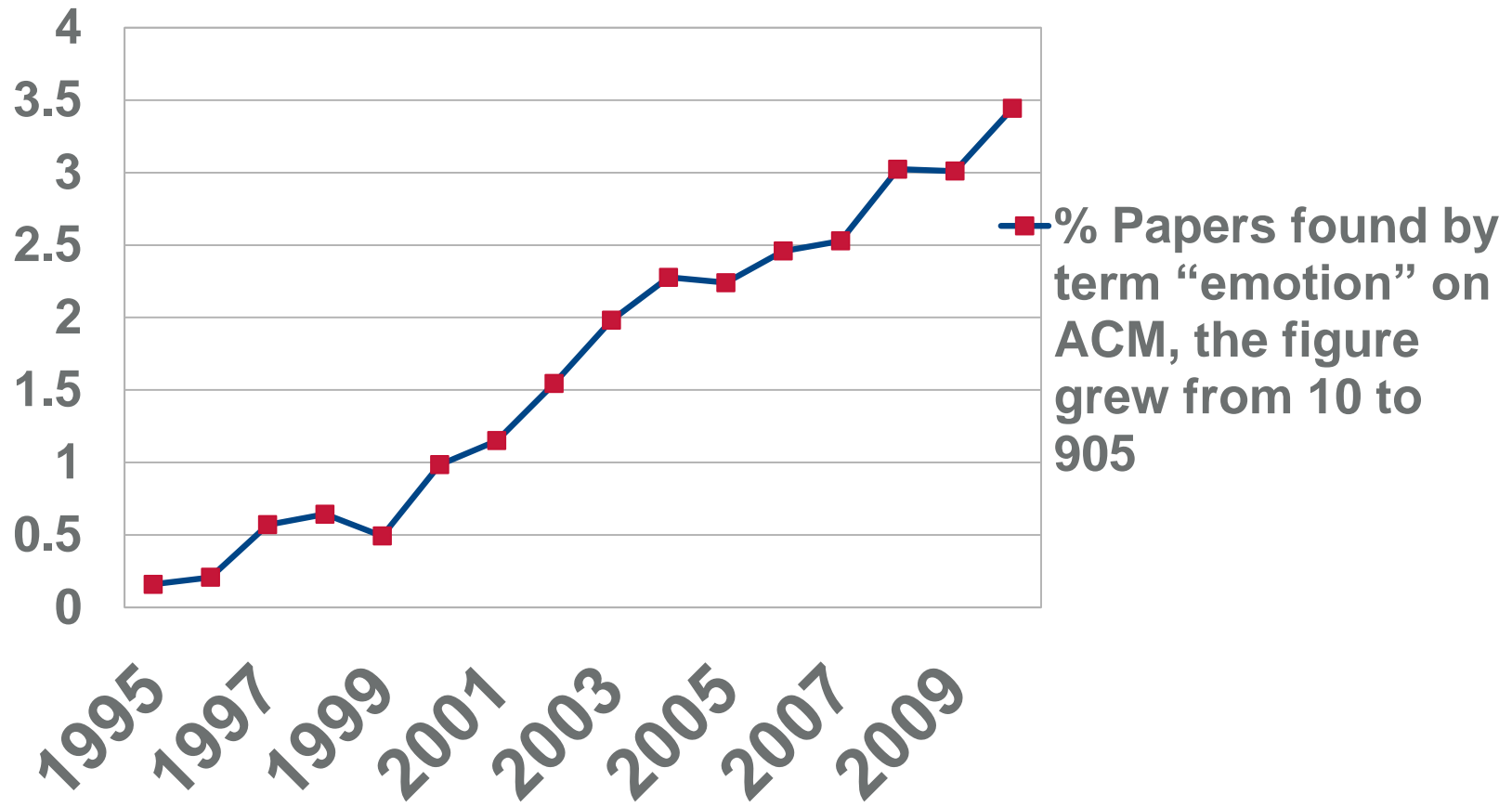
Rosalind Picard coined the term “affective computing”

The first manuscript was rejected two times

Her first paper includes several ideas regarding using affective computing for multimedia content management:

- Summarization
- Profiling/preferences
- Annotation, recommendation and retrieval
- Aesthetics, interactive emotional content

Affective computing



Affect and multimedia

Affective responses are personal and user-dependent
There is a more common response to content, i.e.
genre ,e.g., most of you are bored.

Significance:

- ACM MM grand challenges
 - » HP Challenge: Understanding the Emotional Impact of Images and Videos.
- Growing interest from industry from cosmetics to broadcasting.
- Real world examples:

Real world examples -online radios

The screenshot shows the Musiccovery website interface. At the top left is the Musiccovery logo. A search bar with the placeholder text "Search an artist" is located at the top center. Below the search bar are navigation tabs: "Mood", "Dance", "Artist radio", "New", "Widget", and "Lab". Under the "Mood" tab, there are sub-tabs for "Favorite Songs", "Favorite Artists", "Hits", and "Discovery". The main content area features a mood visualization chart with axes for "Dark" vs "Light" and "Energetic" vs "Calm". A vertical bar on the right of the chart is currently set to "Fever" by Beyoncé. Below the chart is a decade selector (50s, 60s, 70s, 80s, 90s, 00s) with a red line indicating the current selection at 1956. There are also genre selection checkboxes for Vocal Pop, Disco, Reggae, Latino, Rap, and Rock, along with a "more genres" link. To the right of the mood chart is a grid of music recommendations, each with a cover image and text: "Stayin' alive" by The Bee Gees, "Rock Fort Rock" by The Skatalites, "En Guantanamo de" by Orquesta, "Fever" by La Lupe, "Pump it" by Black Eyed Peas, "N-Trance", "The Salsoul", "Eldissa", "Live Canal+", and "Remix".

remix covers
...ate careers, blissfully unaware that his true love, writing
s, could provide an anchor capable of holding his
ion still

Affect definition and terminology

We are emotions? No consensus among psychologists

According to the cognitive theory of emotions:

“ An episode of interrelated, synchronized changes in the states of all or most of the five organismic subsystems in response to the evaluation of an external or internal stimulus event as relevant to major concerns of the organism.”

Klaus Scherer

Stimulus → perception of an event/action → evaluation
according to norms → subjective feeling

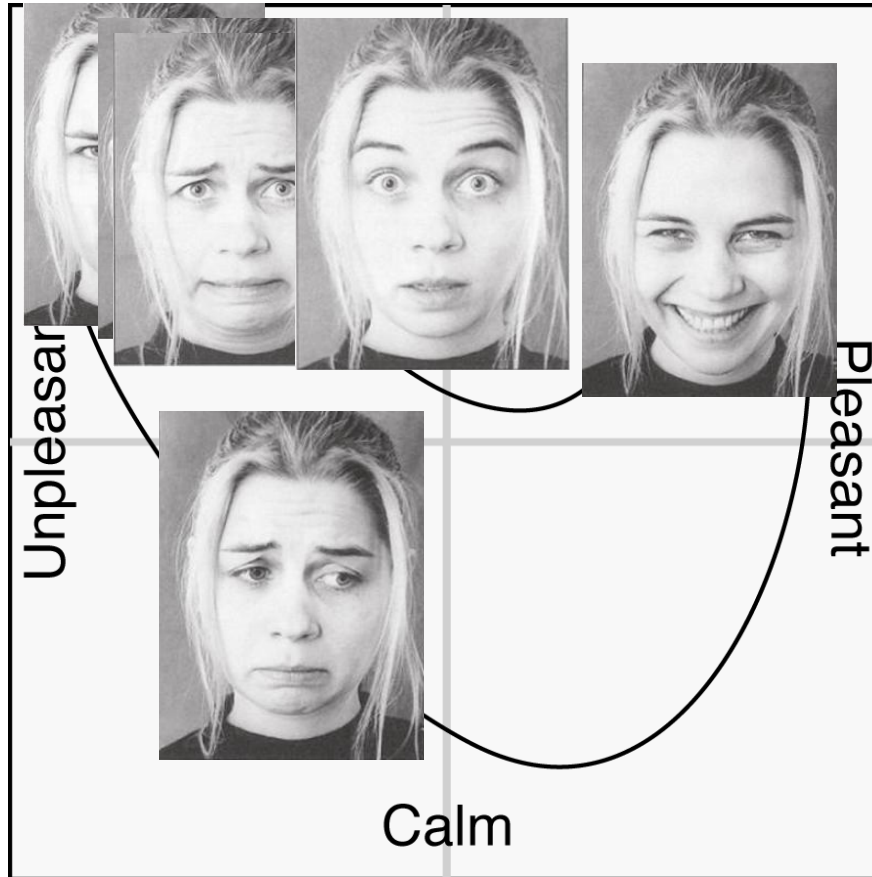
e.g. you are jogging and hear a dog barking

→ fear/anger depending on the size of the dog

Definition of affective terms

- **Emotion or affect:**
 - » Utilitarian: supported by Darwinian perspective.
Examples: fear, anger, etc
 - » Aesthetic: present in art, e.g., appreciation
- **Mood:** diffused affective state, long term, often without a certain stimulus

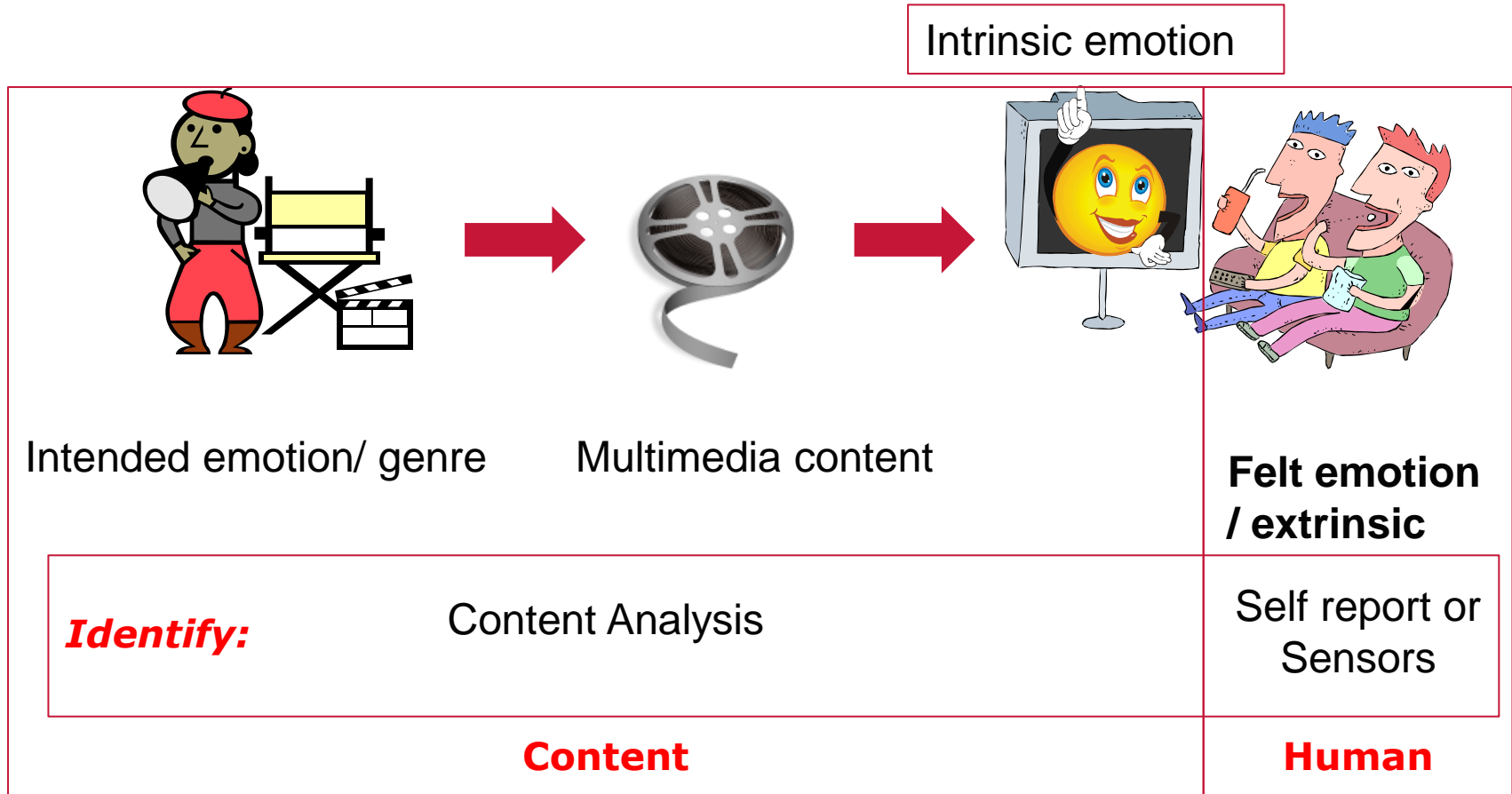
Emotional representation



Dietz & Lang, 1999

- Arousal and valance are correlated
- There are overlapping emotions
- Some set of basic emotions are biased toward the negative emotions

Affect in response to Multimedia



State of the art

[Extrinsic] Affective tagging or summarization:

- User generated; users can assign tags e.g., funny, disgusting, etc

• **Content based, based on content, color, rhythm, etc.**

- Implicit (behavior based from sensors)
 - » Facial expressions
 - » Physiological signals
 - » Speech prosody and utterances

State of the art, cntd.

Study	Dataset	Emotional rep.	Annotators/Annotations
Hanjalic & Xu 2005	2 movies and 2 soccer matches	Continuous	None/None
Wang & Cheong, 2006	36 Full-length movies	Discrete	3/ Ekman basic emotions
Yang et al, 2008	Full-length tracks	Continuous	253/ pairwise, valence
Xu et al, 2008	720 minutes selected scenes	Discrete	?/discrete
Soleymani et al, 2009	21 full length movies	Both	1/continuous
Irie et al, 2010	206 scenes	Discrete	16/discrete
	Too small		Too few/uncertain

Open issues

Dataset development:

Psychological datasets for inducing are irrelevant, e.g.
IAPS

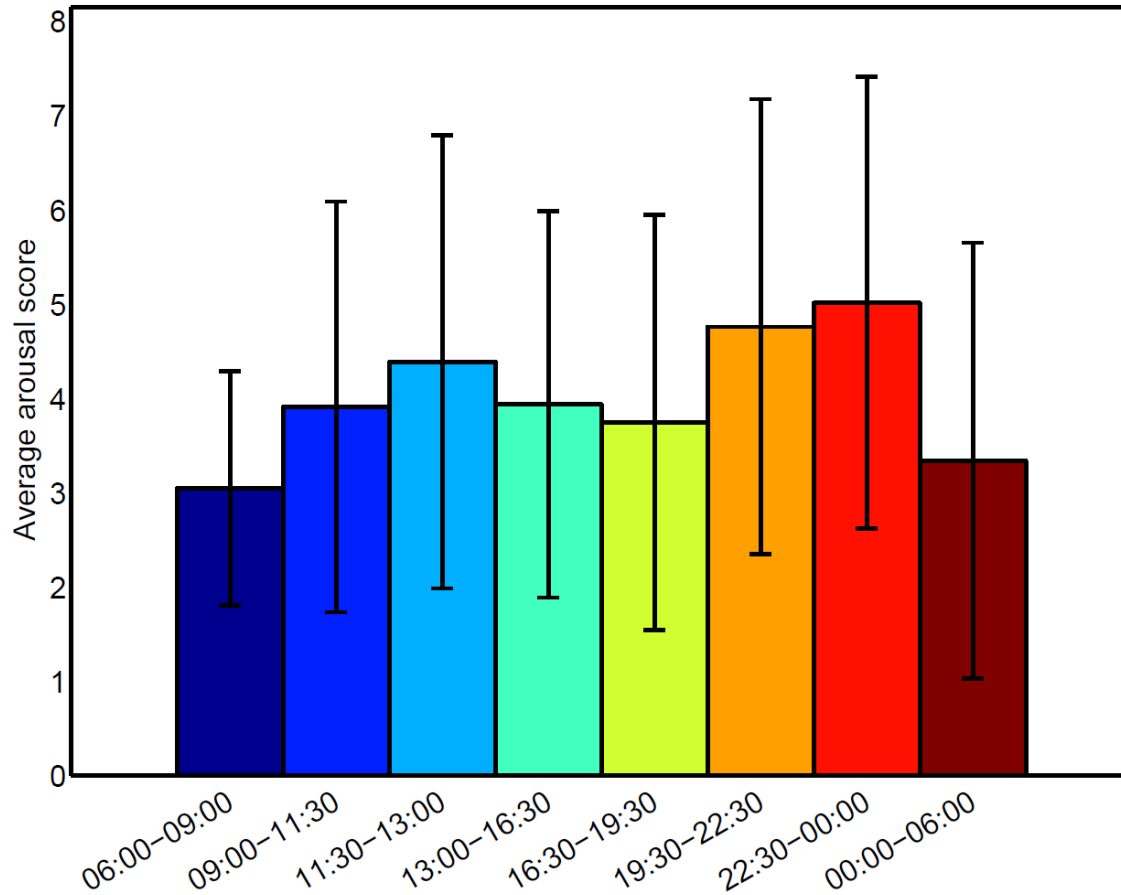
Restricted by copyright and small databases

Models and representations:

Ekman basic emotions are utilitarian and based on facial expression and basic emotions are biased toward negative emotions

Context should be taken into account, time, weather, geo-location, social dimension, age, etc

Context - time



Online study on movies,
Soleymani et al, under
preparation

Best practices

Audio music mood classification (MIREX 2007-2012)

<http://www.music-ir.org/mirex>

Acoustic features

- Toolbox: MIRToolbox

Mediaeval 2010-2012 (focused on one type)

- Boredom detection
- Violence detection

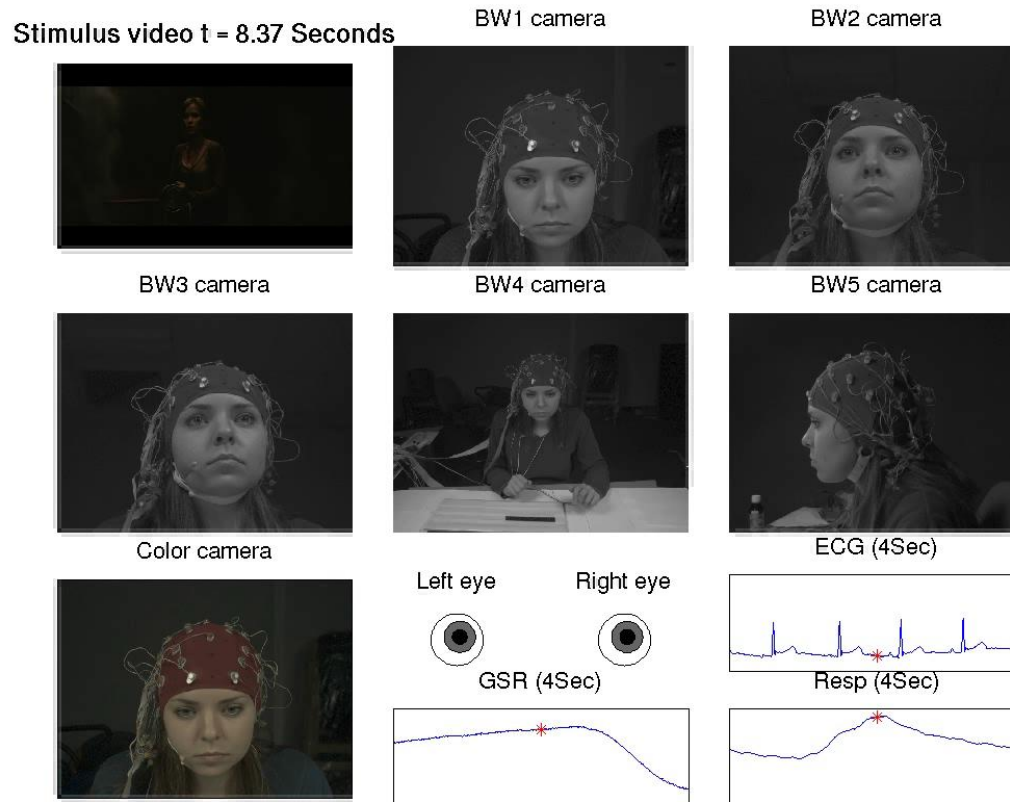
» Use case from Technicolor, movies

Public mood/sentiment detection via social media,

e.g., <http://wefeelfine.org/>

Best Practices -- databases

MAHNOB HCI available at <http://mahnob-db.eu/>



Perspectives

Commercial products will emerge

- New technologies will facilitate the research, e.g., sensors will help tagging, Kinect face tracker, Emotiv & Neurosky helmets.

More collective work on standard benchmarking development.

- Large databases with annotations

Better understanding between communities:

- IEEE Trans. Affective Computing
- **Affective Computing and Intelligent interaction 2013, Geneva, Switzerland** (<http://www.acii2013.org>)

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