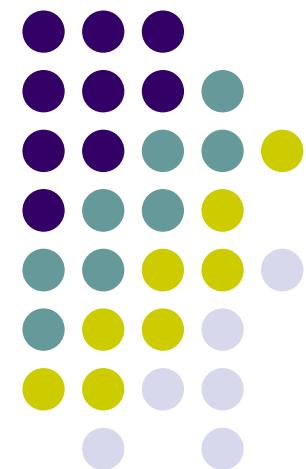


# **Ubiquitous and Mobile Computing**

## **CS 528: Your Reactions Suggest You Liked the Movie: Automatic Content Rating via Reaction Sensing**

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# We Have & We Want

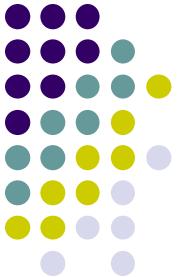
- Numbers?
- Stars?
- Percentages?
- Lossy
- Time-consuming



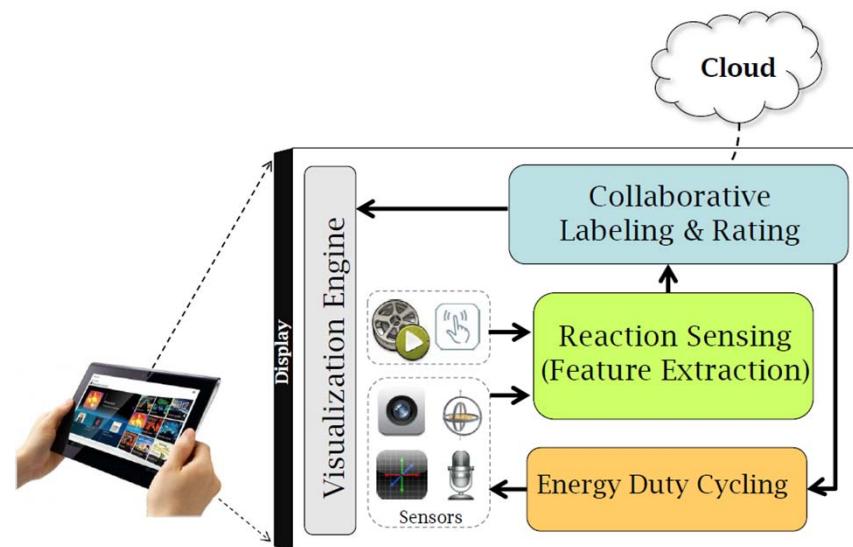
★★★★★  
**Breathtaking**  
Sci-Fi Funny Boring  
**Smile**  
**Exciting** Warm Drama



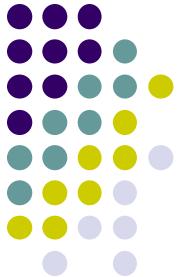
# Pulse system



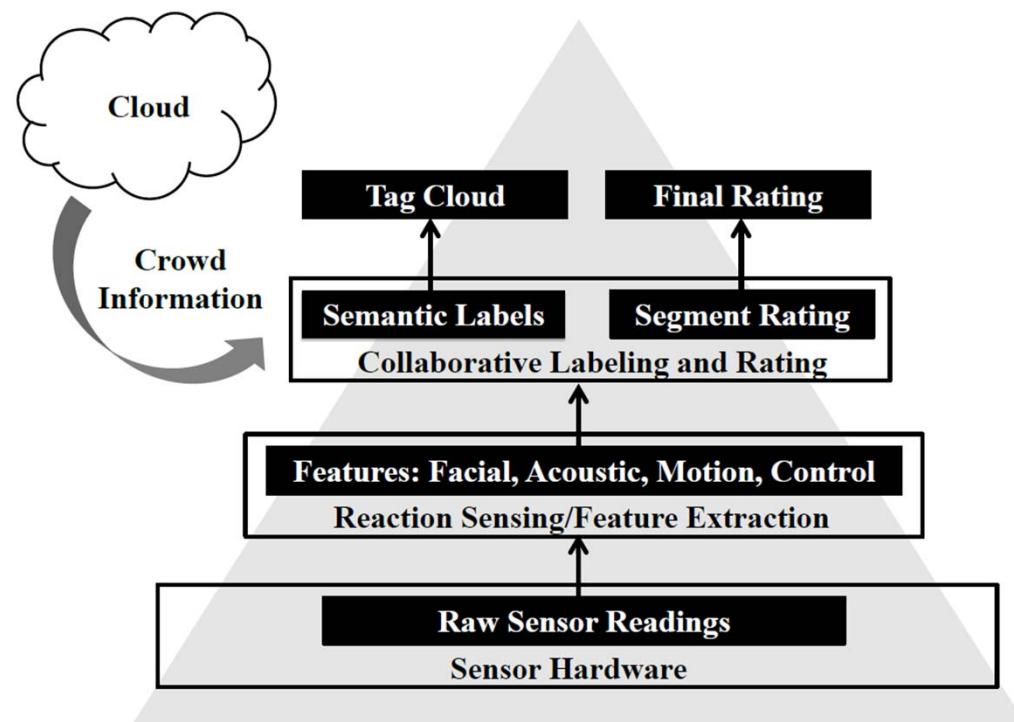
- Mobile platform
- Based on Android
- Using sensors
- Sensed reactions -> ratings



# Reaction Sensing / Feature Extraction



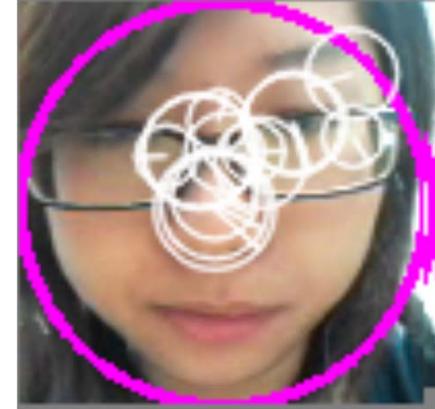
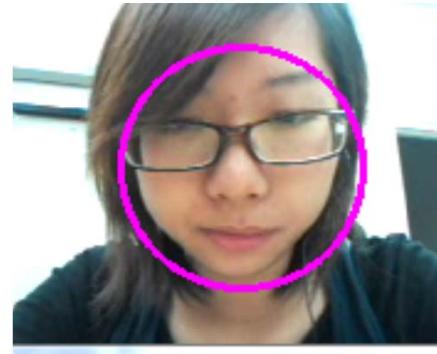
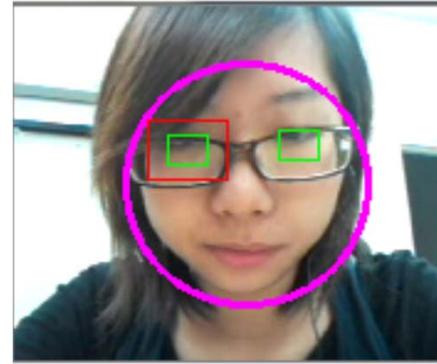
- Visual
  - Face
  - Eye
  - Blink
- Acoustic
  - Voice
  - Laughter
- Motion
- Touch





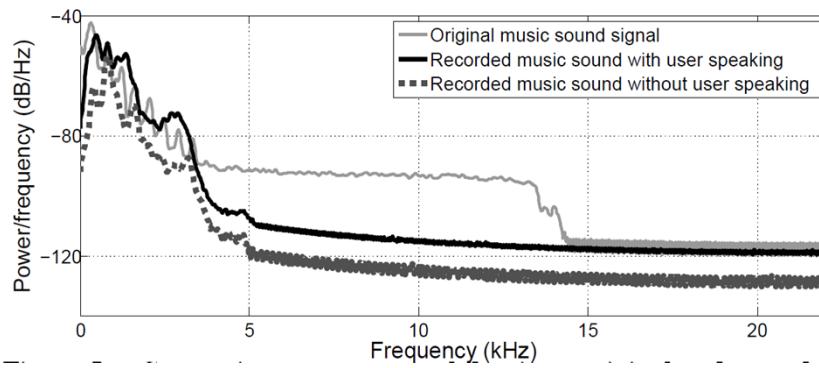
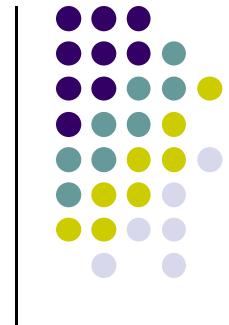
# Visual

- Continuous contour matching
- Eyes and key points
- Blink-detection & eye tracking
  - Changed pixels in consecutive frames
  - Useful for users with spectacles
- Features:
  - Face, eyes, lip, etc.
  - Position, size, etc.



# Acoustic

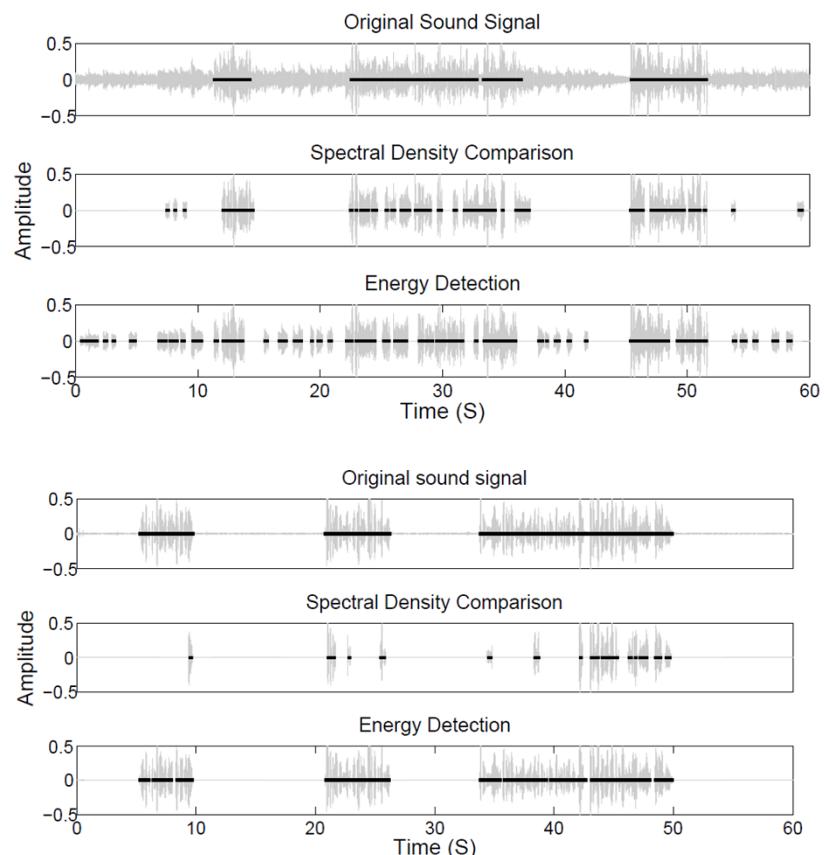
- Activates microphone
- Records ambient sounds
- Separate users' voice



# Acoustic: Voice

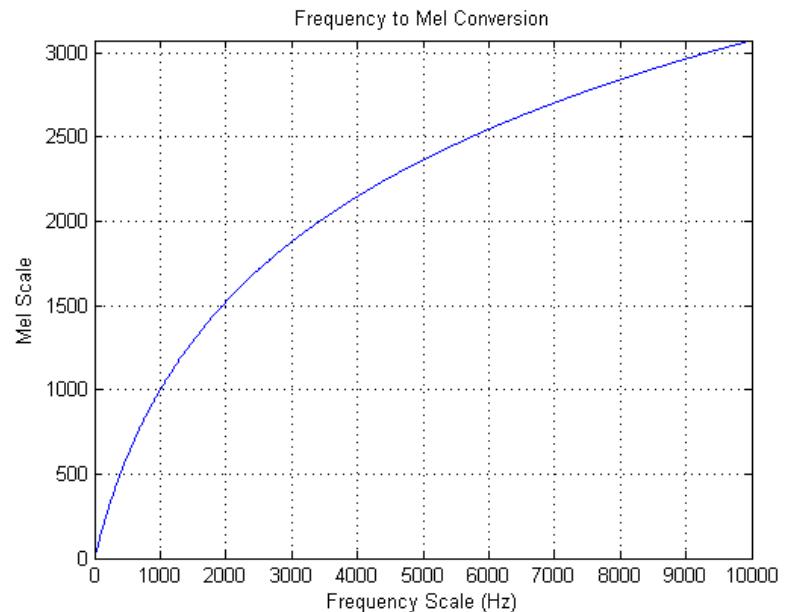
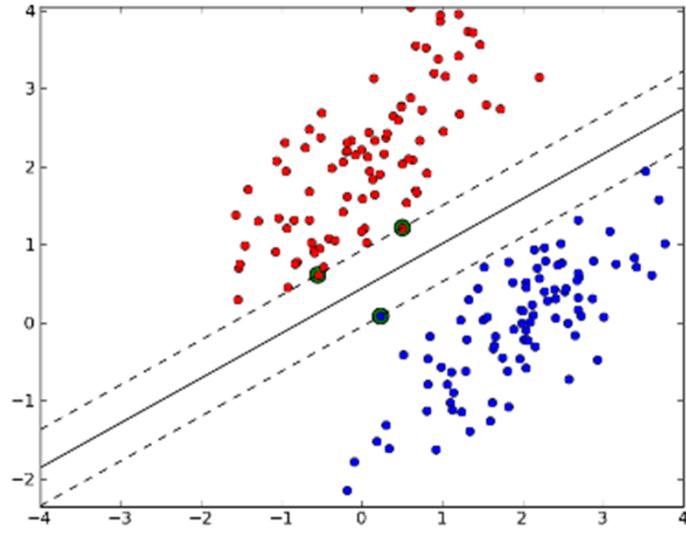


- 2 heuristic methods
  - Energy detection w/ speech enhancement
    - Noise suppression
    - Low ambient volume
  - Per-frame spectral density
    - Per-frequency amplitude
    - High ambient volume



# Acoustic: Laughter

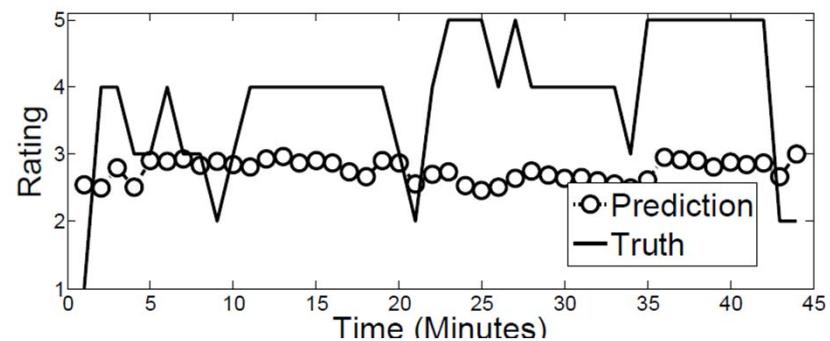
- Support vector machine (SVM)
- Mel-Frequency cepstral coefficients (MFCC)



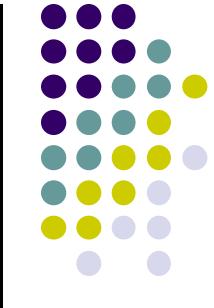


# Collaborative Labeling & Rating

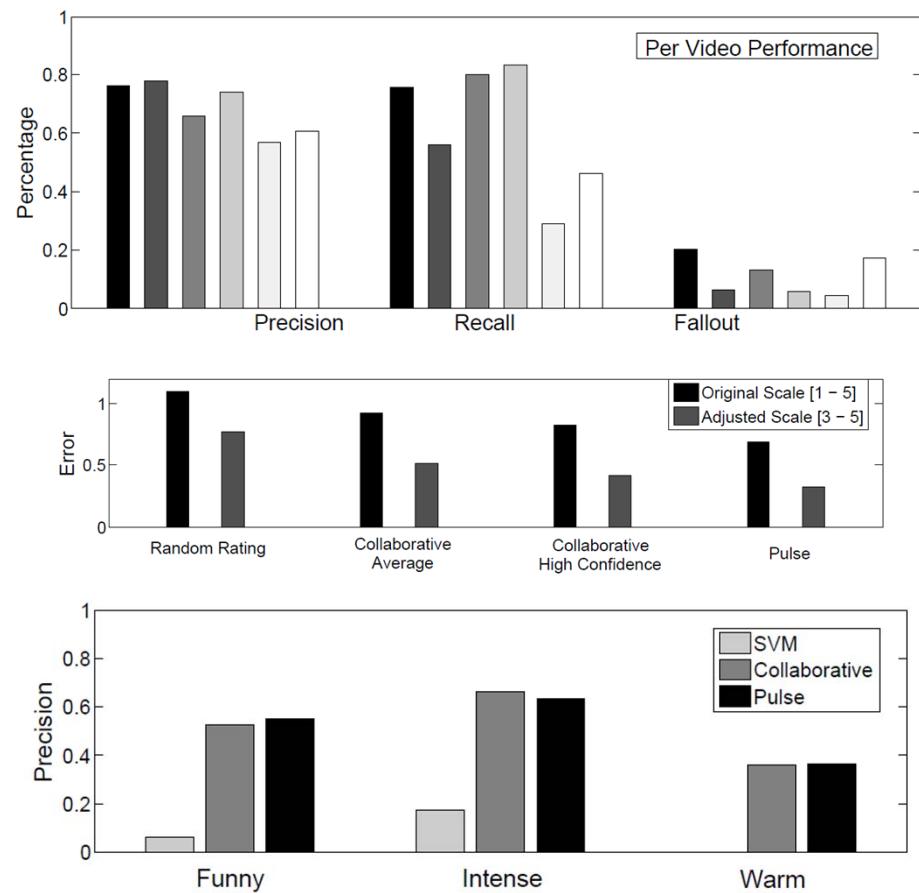
- Reaction labels
- Perception labels
- Combining  
Collaborative Filtering  
and SVM/GPR
- Accuracy and  
heterogeneity



# Results



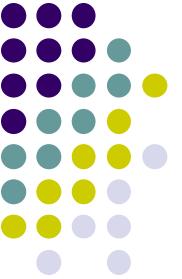
- Segment rating
  - Average error 0.7
  - 71% precision, 64% recall, 9% fallout
- Final rating: Average error 0.46
- Label quality: much better than pure SVM
- Power consumption: 16% more





# Conclusions

- Advantages
  - New aspects of rating
  - High accuracy
  - Holding variety
- Issues
  - Sample capacity
  - Over-fitting
  - Privacy



# References

- [http://en.wikipedia.org/wiki/Collaborative filtering](http://en.wikipedia.org/wiki/Collaborative_filtering)
- [http://en.wikipedia.org/wiki/Mel-frequency\\_cepstrum](http://en.wikipedia.org/wiki/Mel-frequency_cepstrum)

# Thank you

