

Adventures in emotion recognition

Rosalind W. Picard, ScD, FIEEE

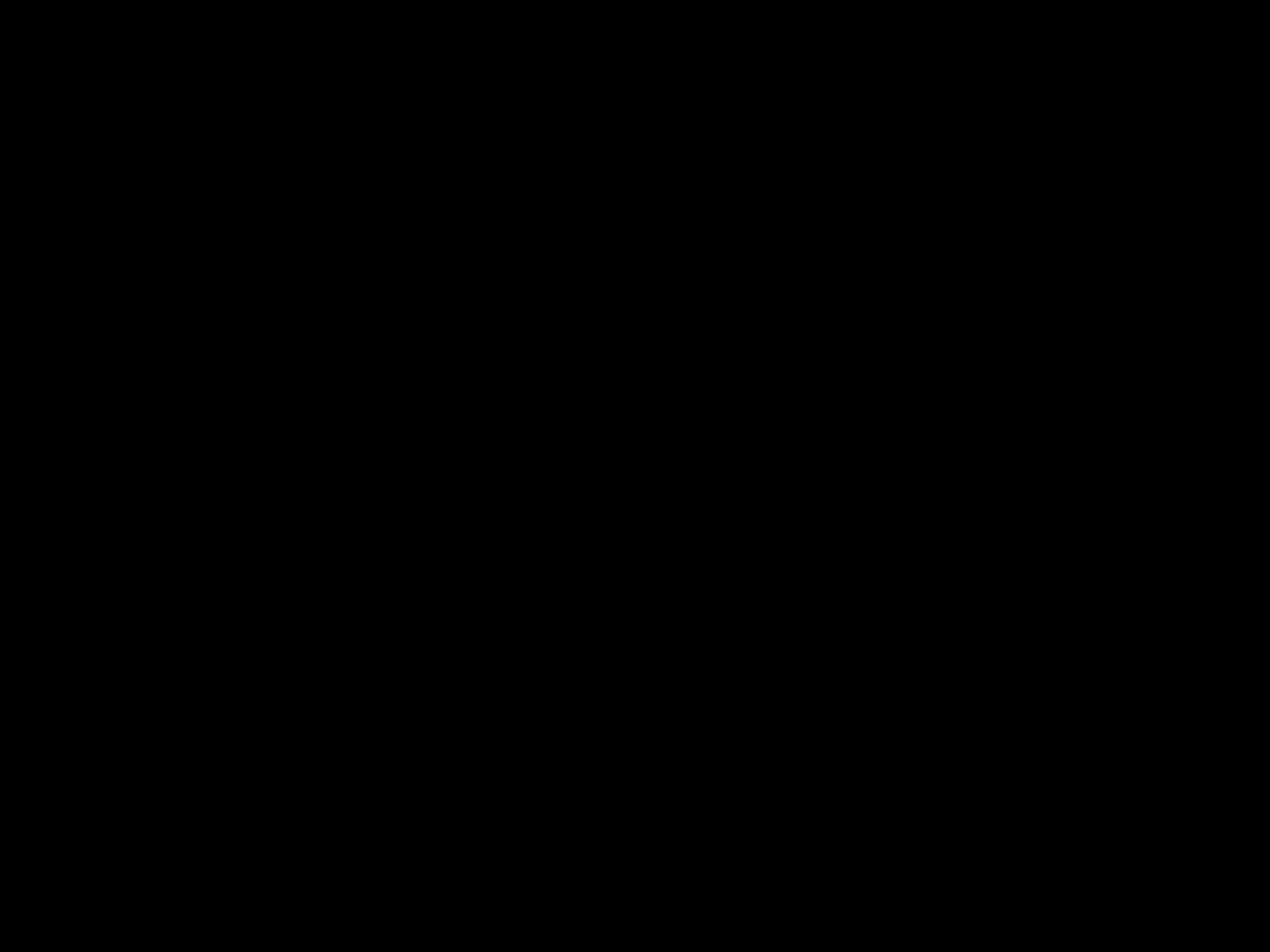
MIT Media Lab

Director of Affective Computing Research

Co-founder, Affectiva Inc.

Twitter: @rosalindpicard

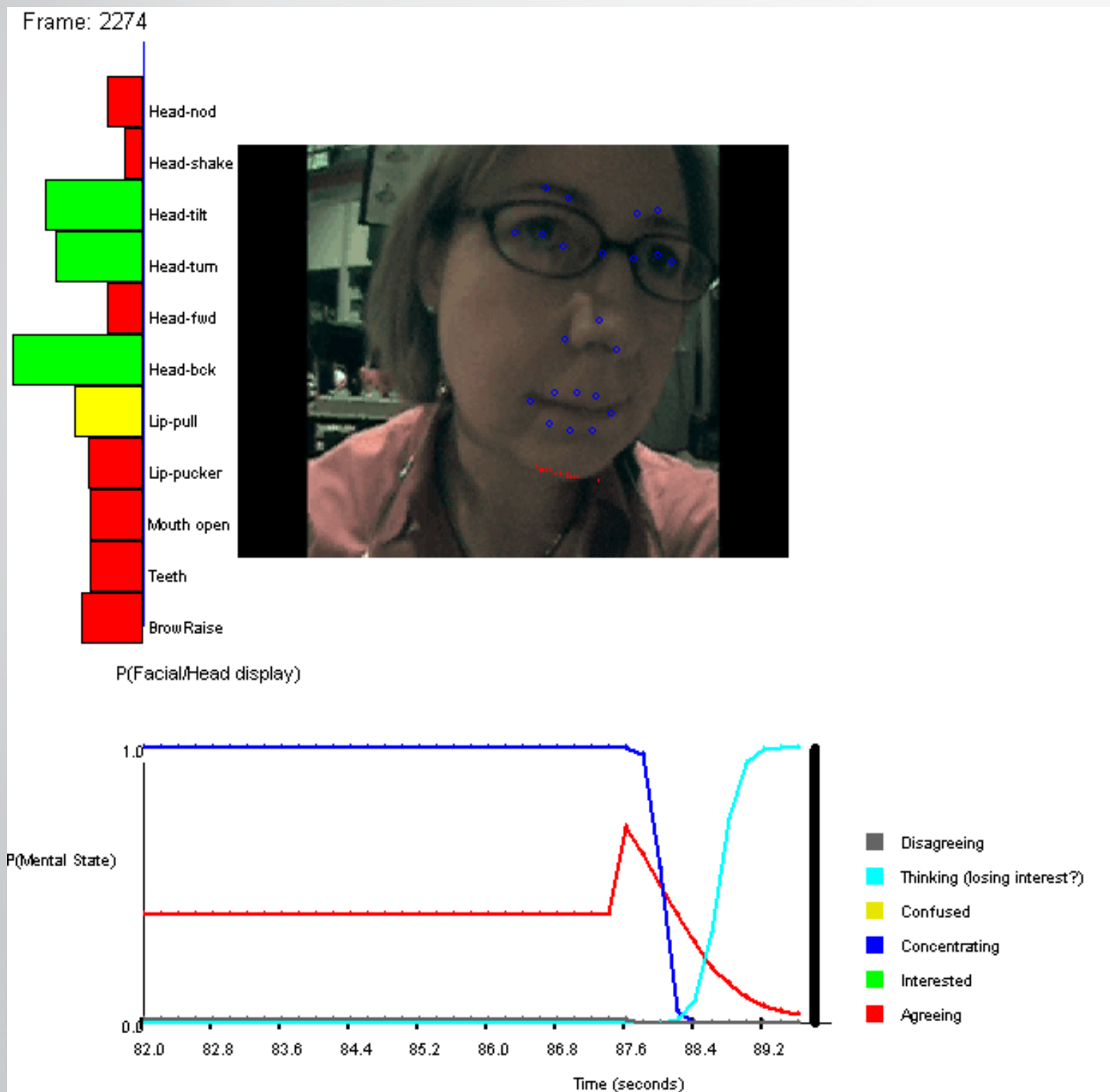
Goal: Help people on the autism spectrum



Tools to learn
about social-
emotional
expressions

*Collaboration
with Groden
Center in
Providence, RI*

Monologue detector (Mono-logger)



"Can you give us something that tells us when to back off?"
-Adults w/Aspergers

Visualize expressions of interest, boredom, turn-taking patterns and couple with dialogue and features

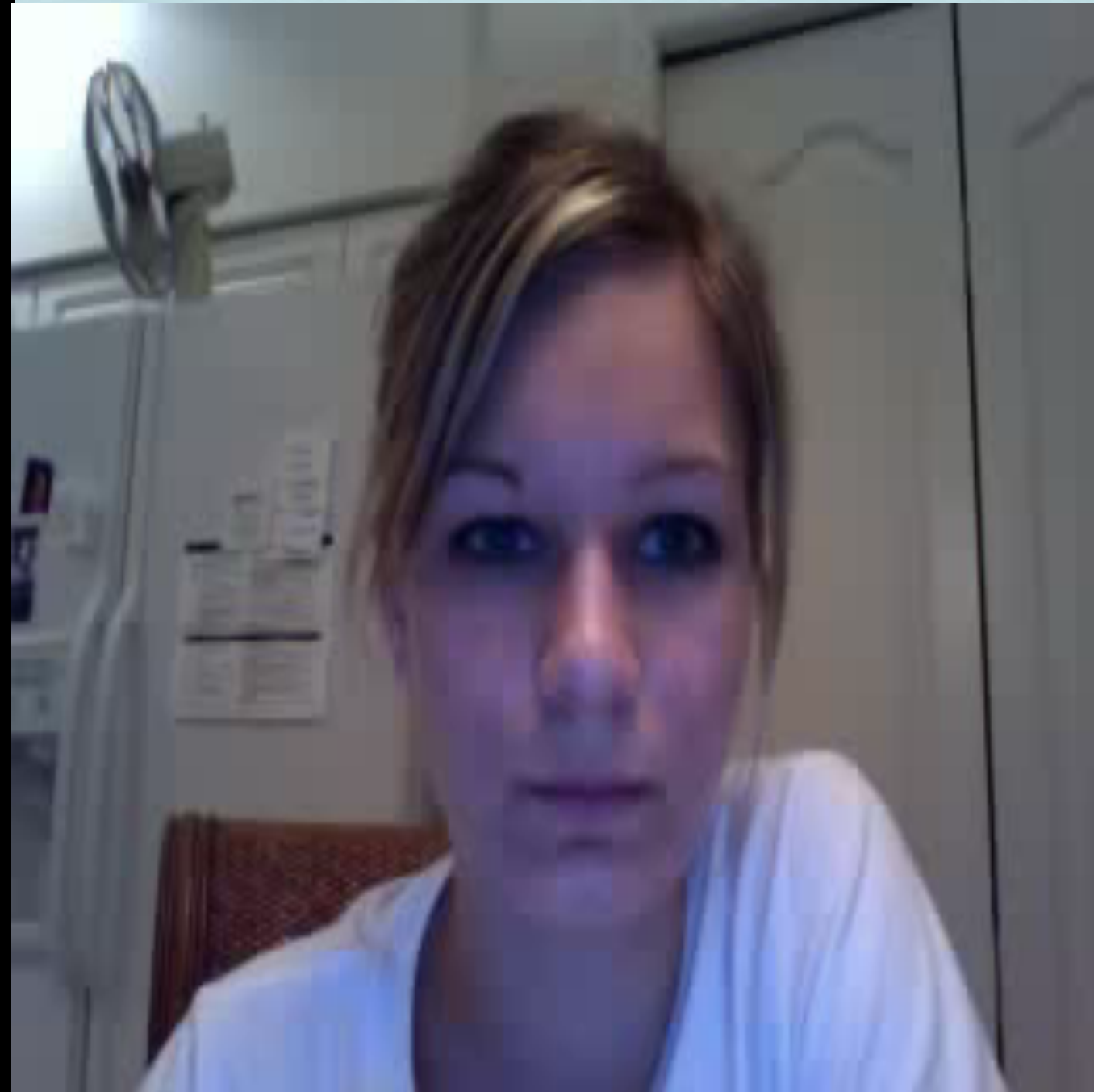
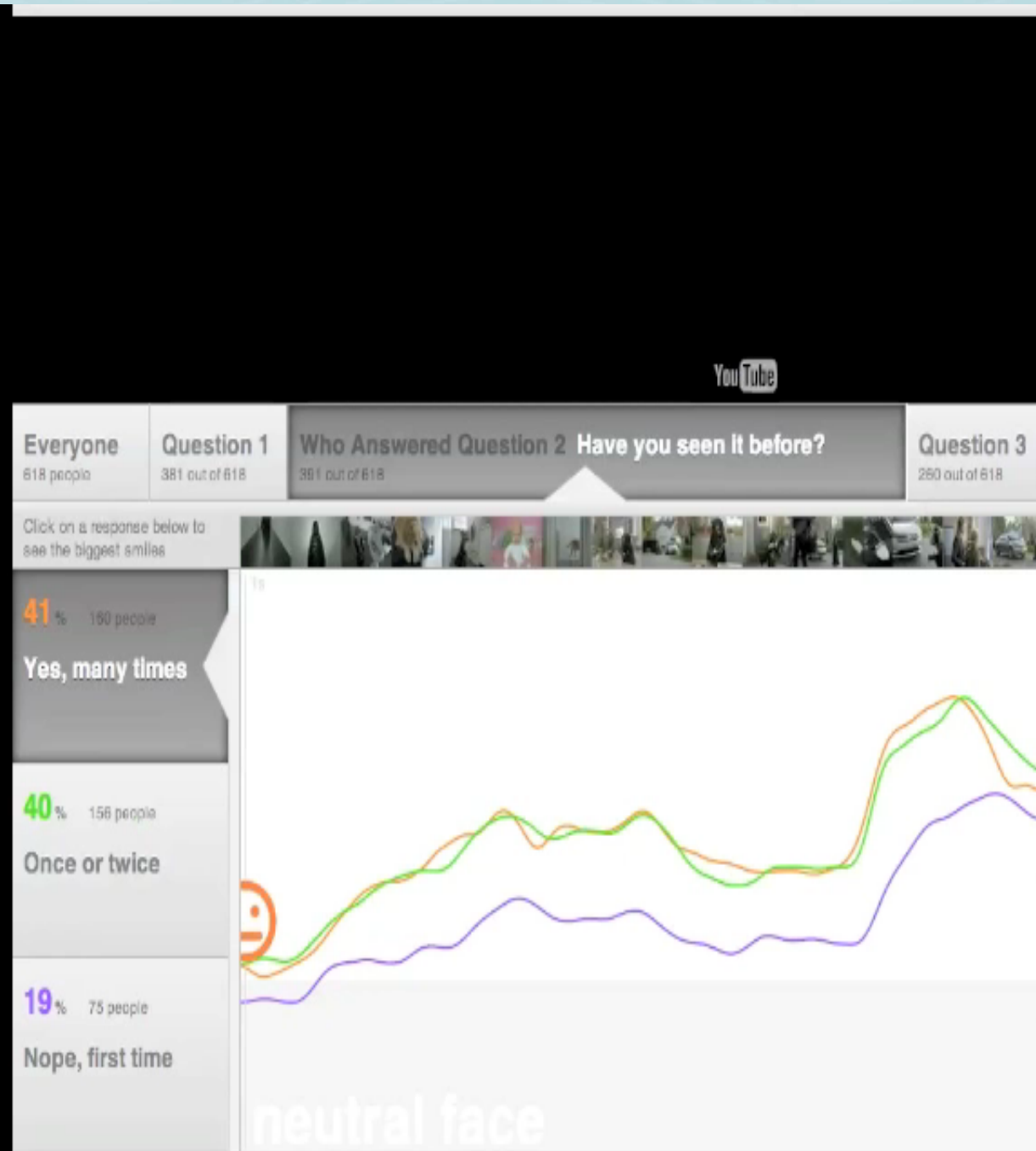
“I like being online. Nobody knows I’m autistic when I’m online”

The first research provided hundreds of labeled videos and cost over \$1,000,000

How can we afford to get millions of videos?

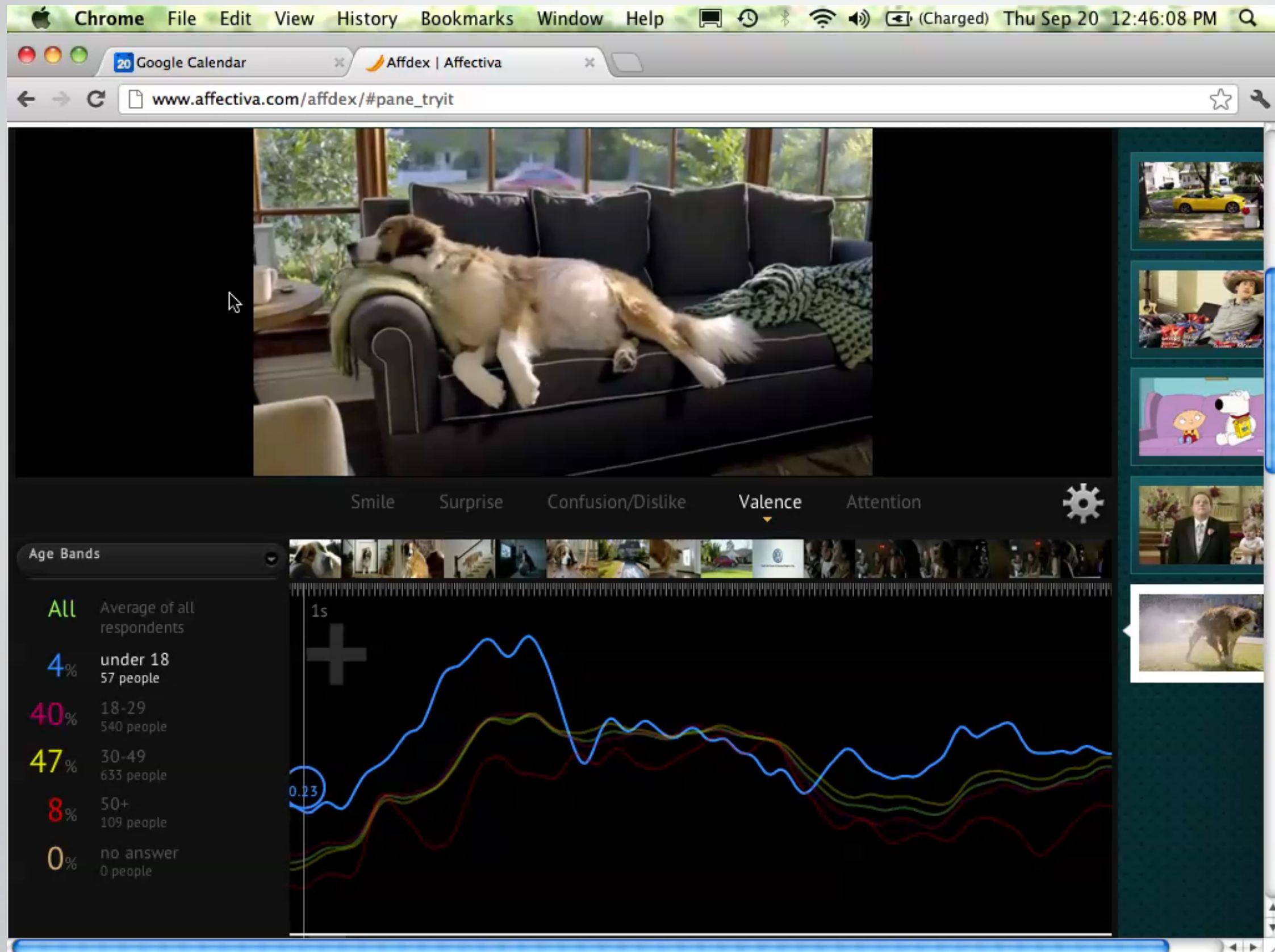


Affdex.com: try demo live with your webcam



McDuff, el Kaliouby, Picard, "Crowdsourcing Facial Responses to Online Videos," IEEE Transactions on Affective Computing, 2012

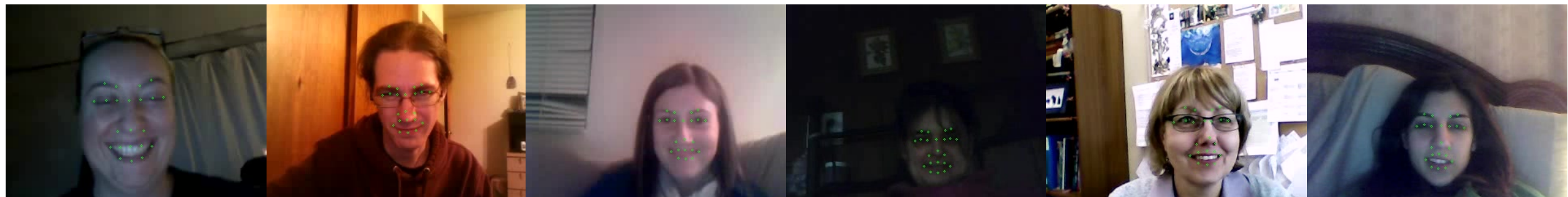
Affdex: view results interactively (affectiva.com)



Data from the wild raises the bar



Academic tradition: Posed expressions, no head movement; well lit, high res, small scale. Results: ~90% AUC on posed, ~65% AUC on real-world spontaneous expressions



High intensity Subtle intensity Blurry video Dark, small face Cluttered Asymmetric

Affdex: Improves science results $\geq 90\%$ AUC on posed expressions, $\geq 80\%$ AUC on real-world spontaneous expressions

World's largest repo of facial emotions

1.2M facial videos

1B+ emotion points



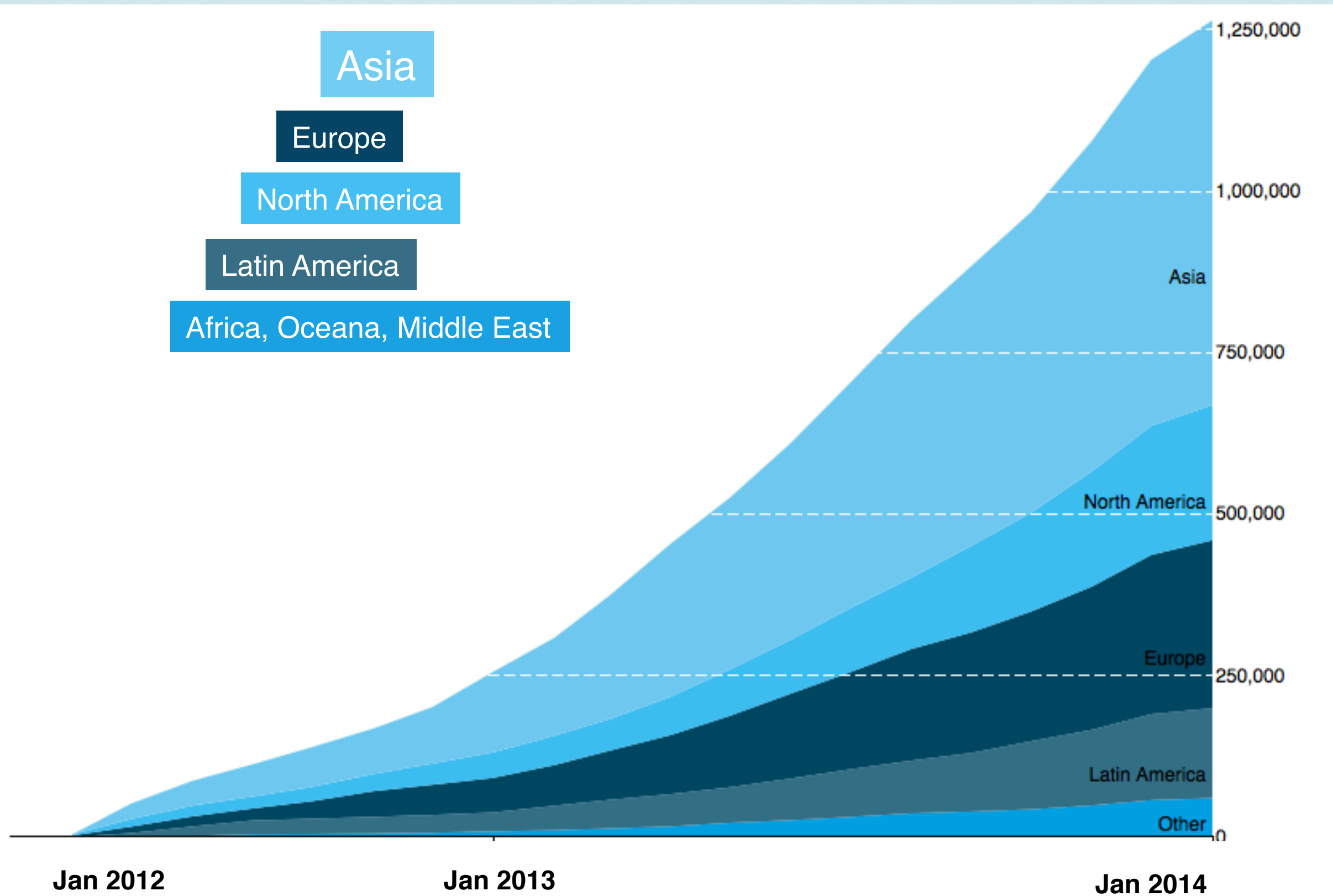
Emotion Ad Norms

60+ Countries

Cross-cultural validation

Accuracy > 90%

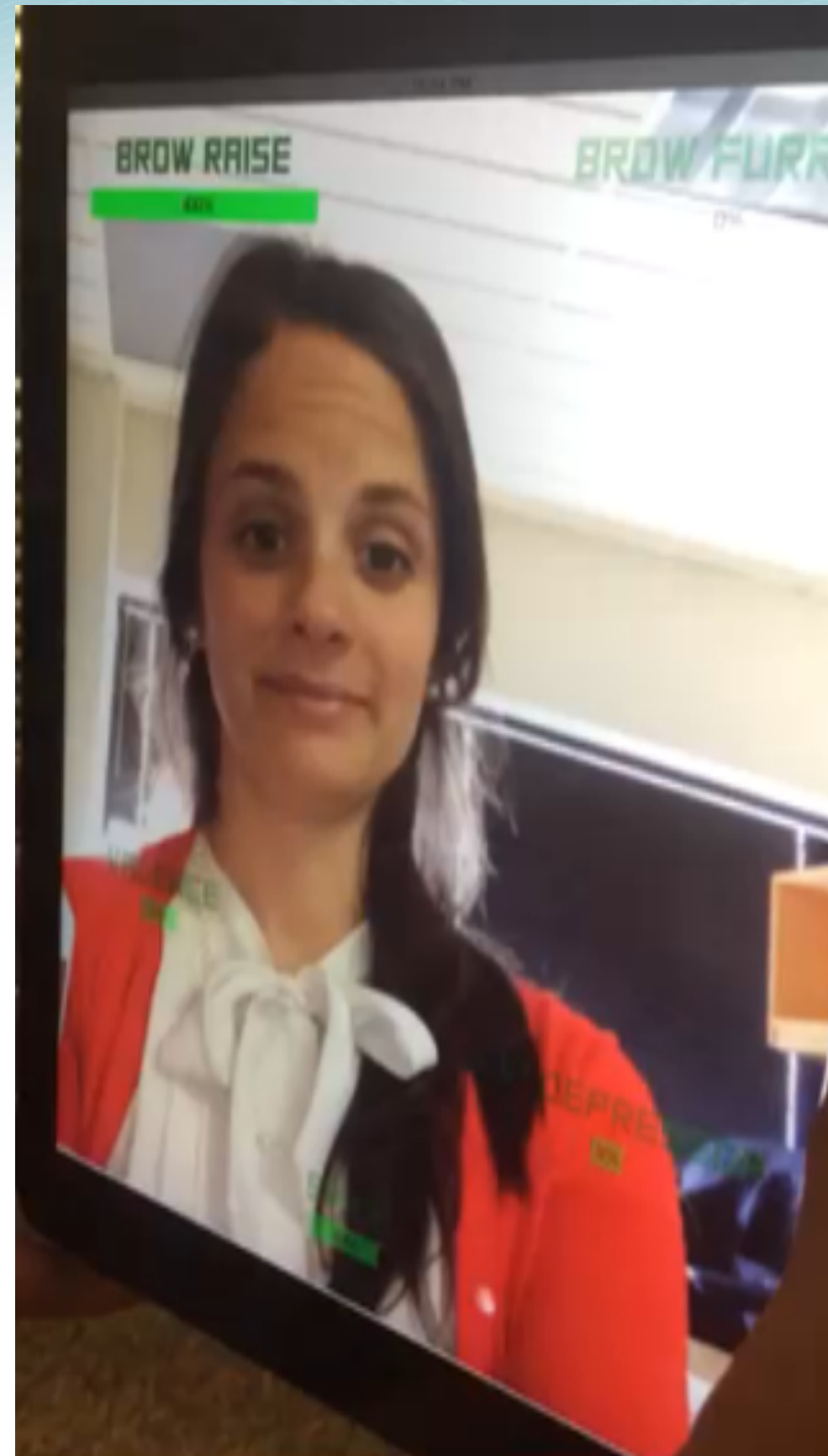
Validation studies completed in Brazil, China, India, United Kingdom, USA, ...with over 300 Global brands!



New FREE SDK!

SDK adds interactive
Affdex to iOS apps on
iPhone, iPad

Android SDK “in Q2”.



What is the most common emotion that technology elicits?

Hint: This next video is a person alone in his office trying to fill out a web form.

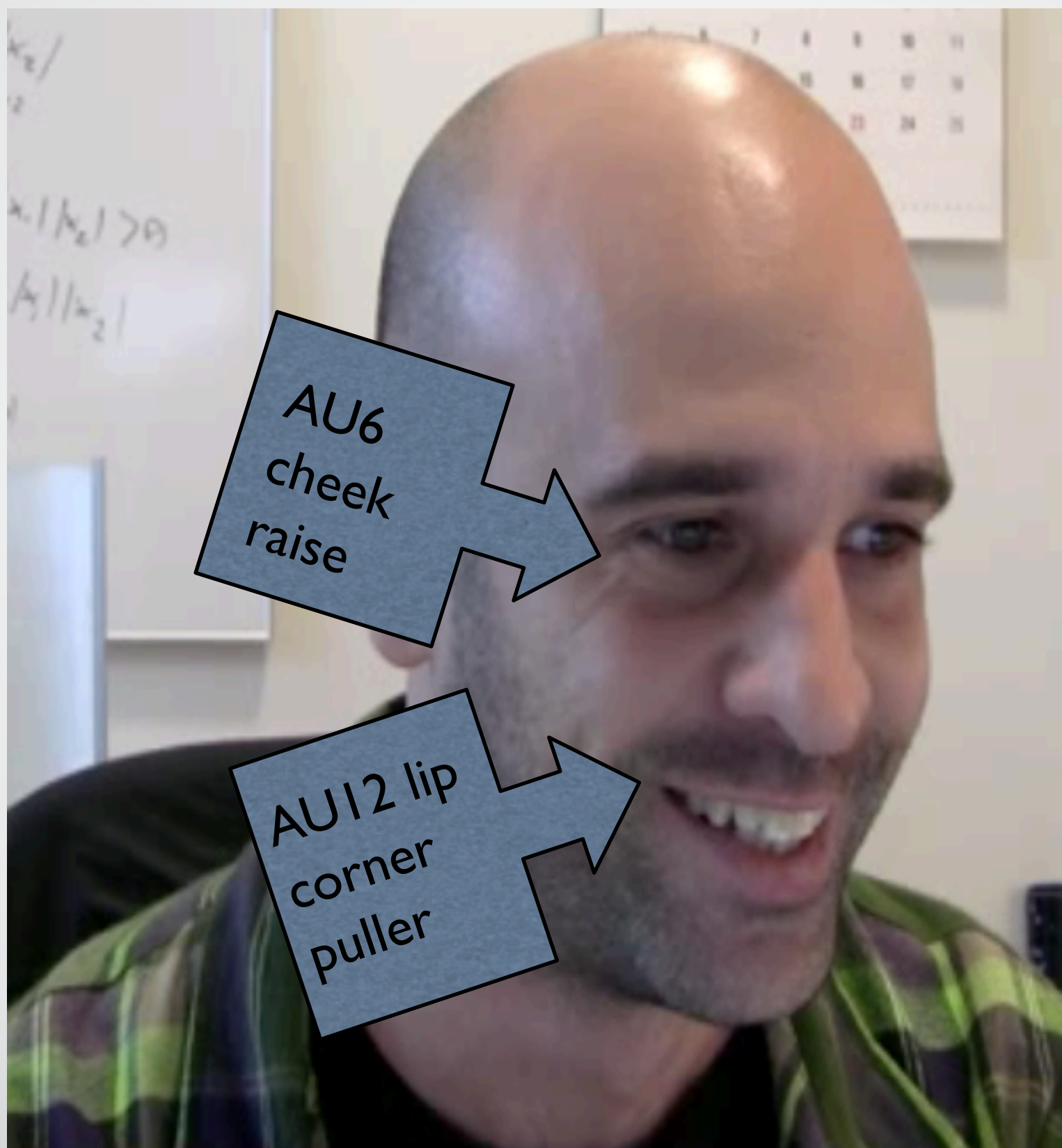


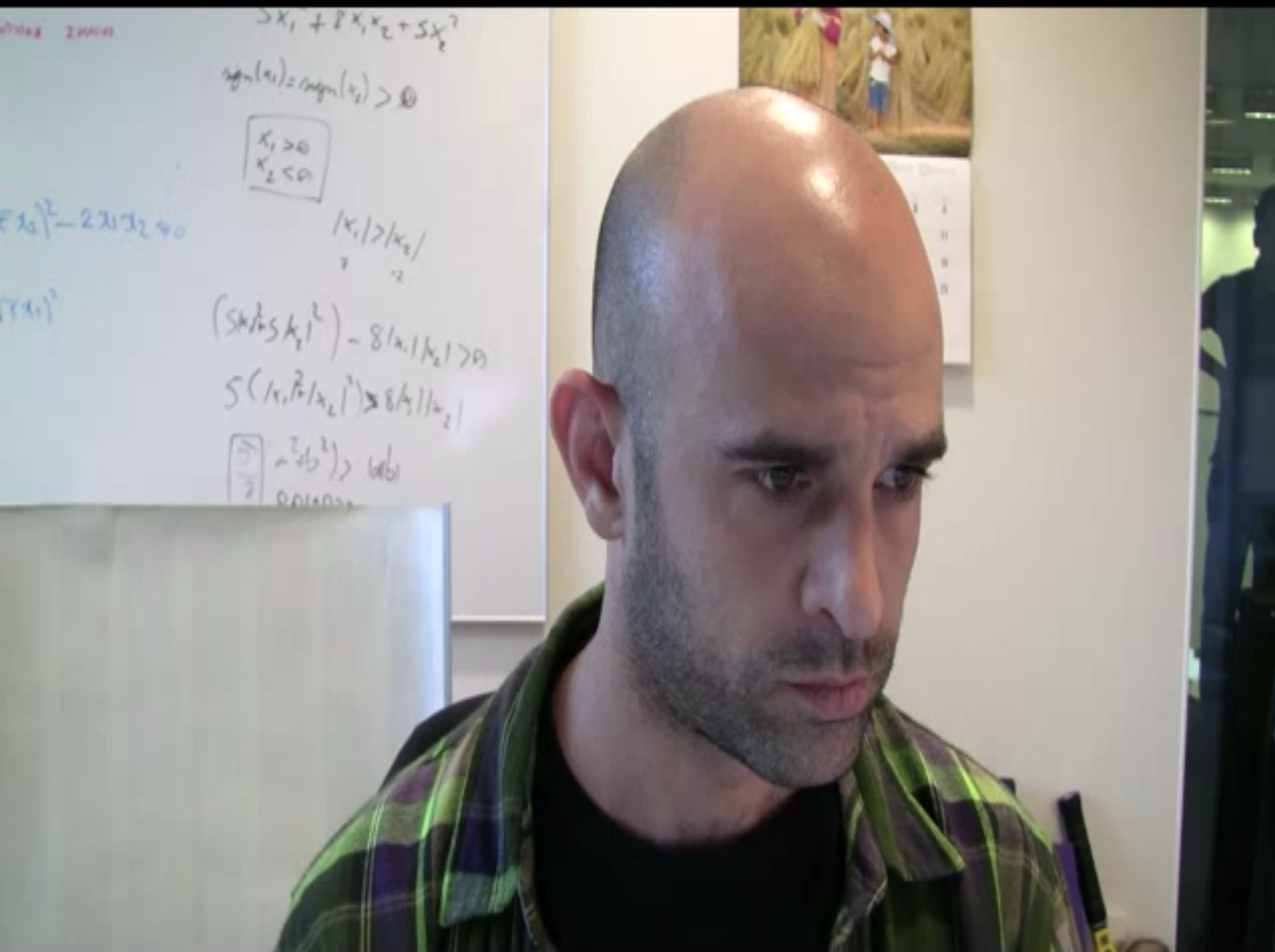
We didn't
tell him we
used
“impossible”
captchas

pliarom

sorted

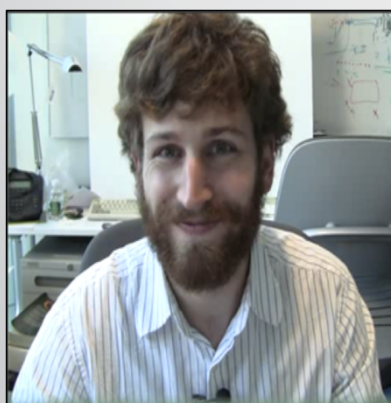
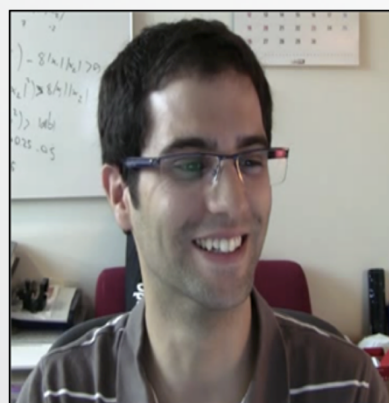
Smile = delight?





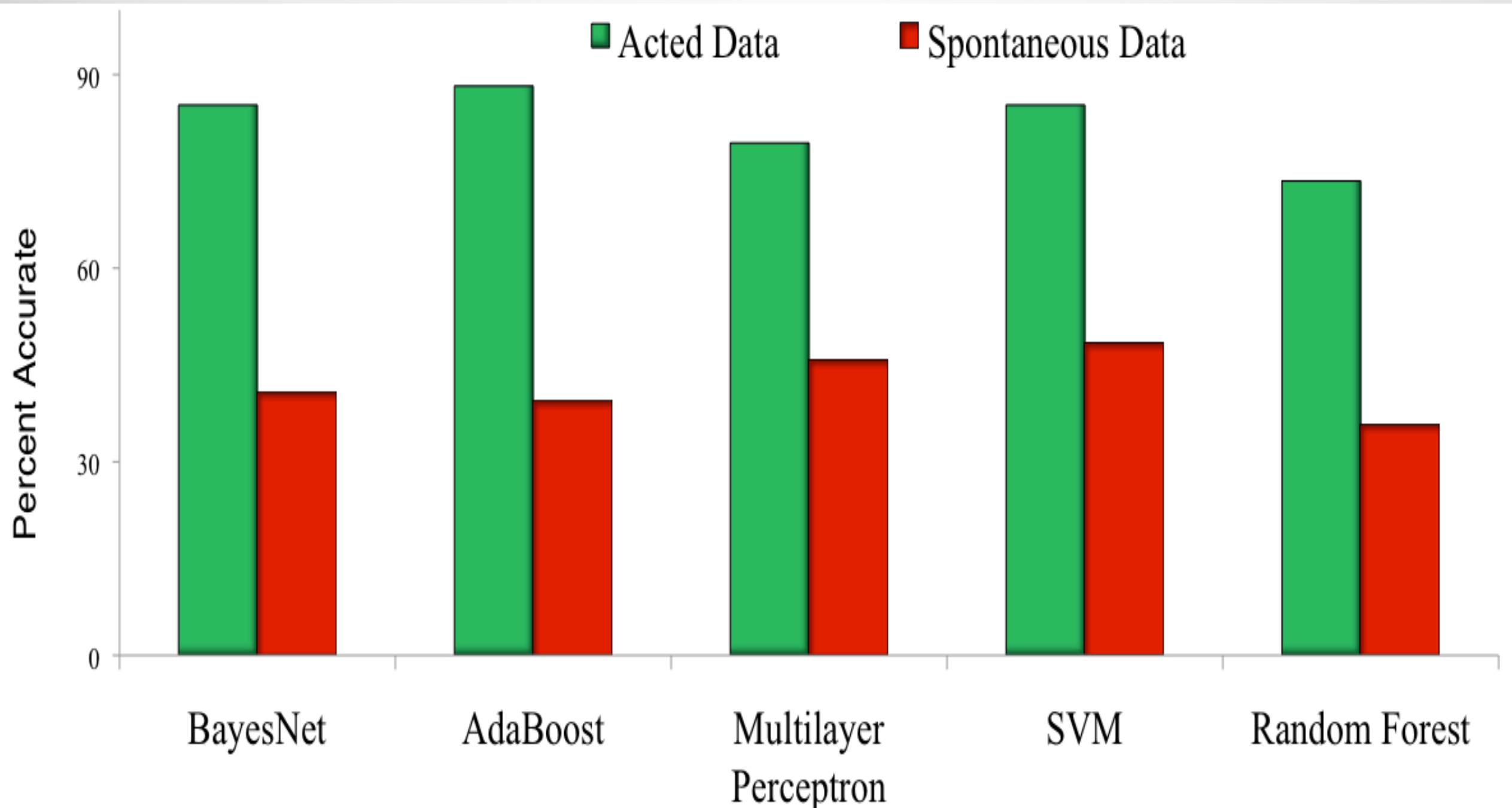
Delight smile or Frustration smile?



**Frustration****Frustration****Frustration****Delight****Delight****Frustration****Delight****Delight**

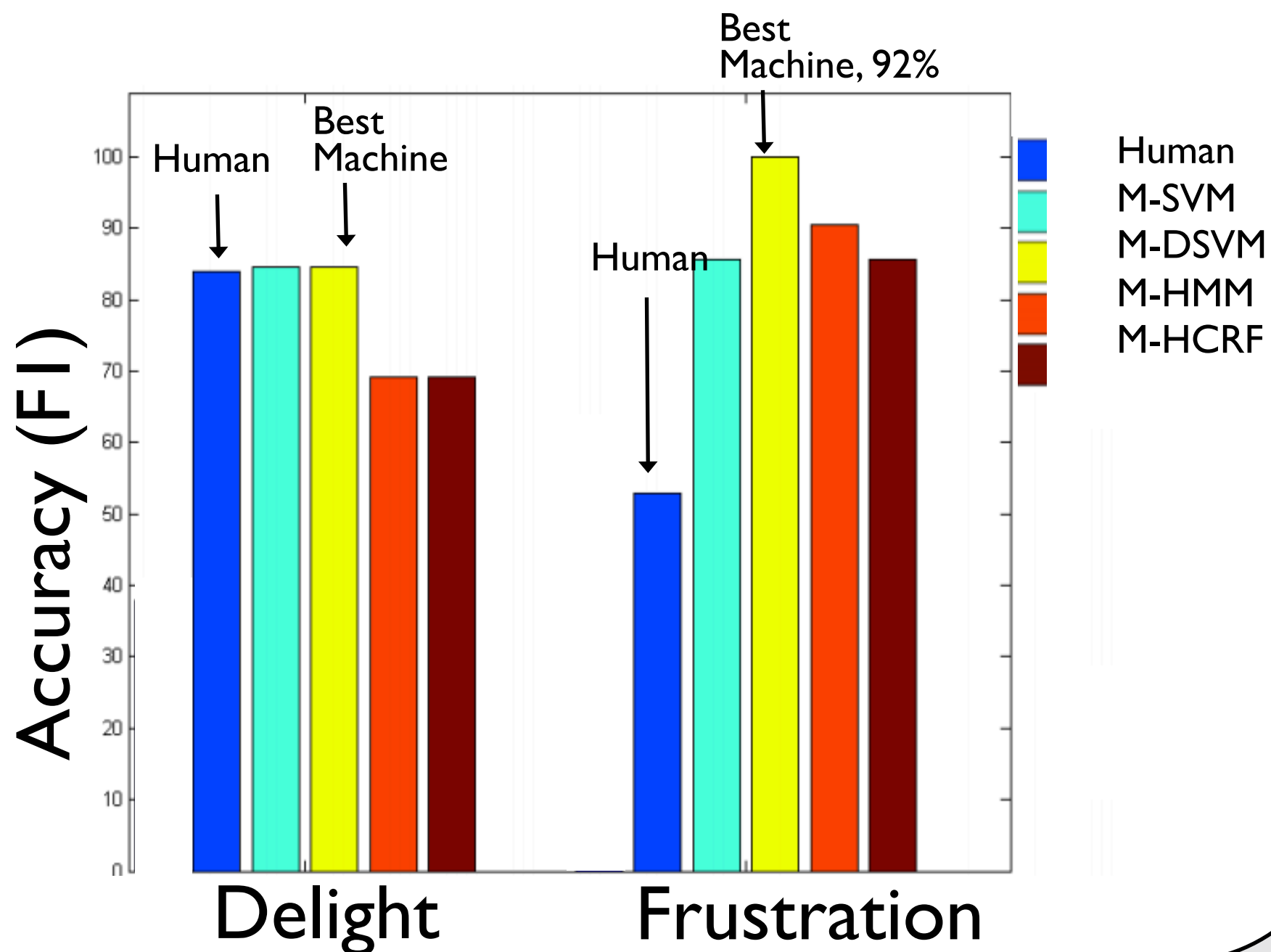
Machine recognition of **spontaneous** emotion is **VERY HARD**

Classification accuracy of recognizing frustration, delight and neutral states, leave-one-clip out



Machine learning w/dynamics recognizes delight and frustration smiles

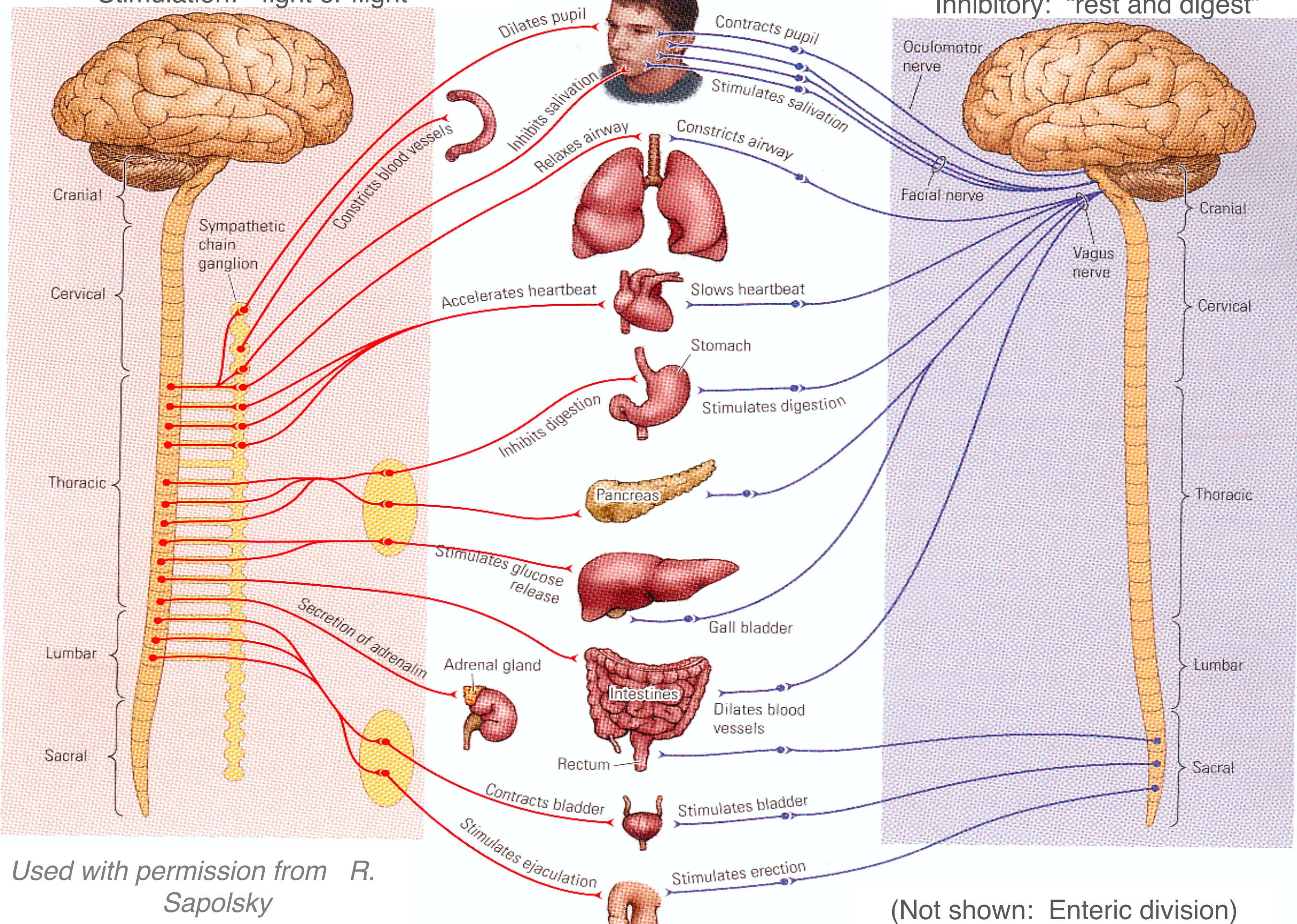
Hoque, McDuff, Picard (2012) IEEE Trans. Affective Computing



AUTONOMIC NERVOUS SYSTEM

Sympathetic division
Stimulation: "fight or flight"

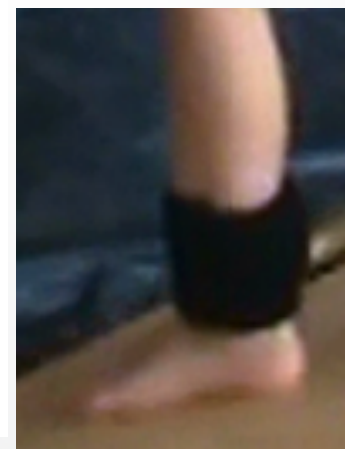
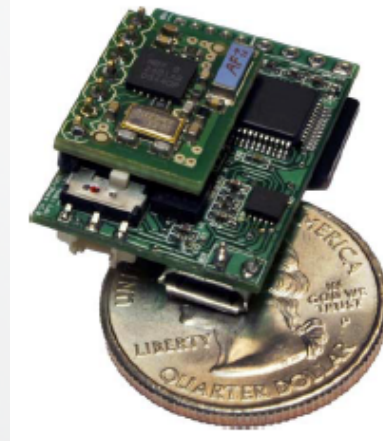
Parasympathetic division
Inhibitory: "rest and digest"



Electrodermal Activity (EDA) Sensors



Traditional

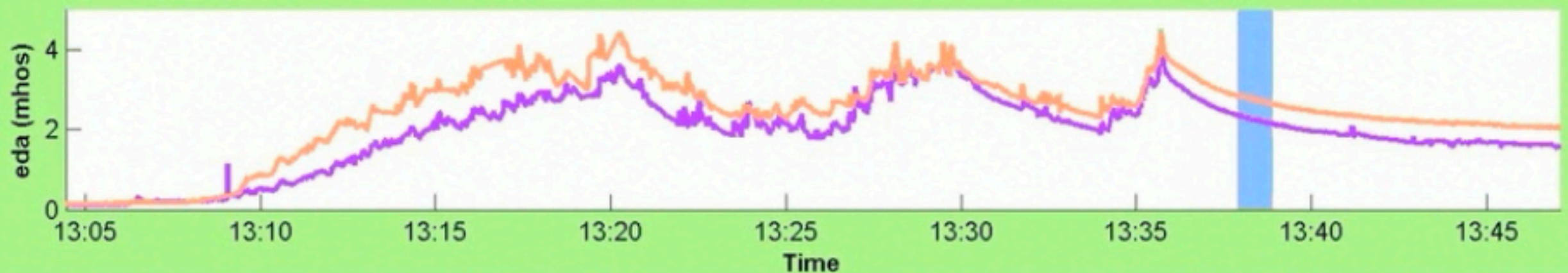
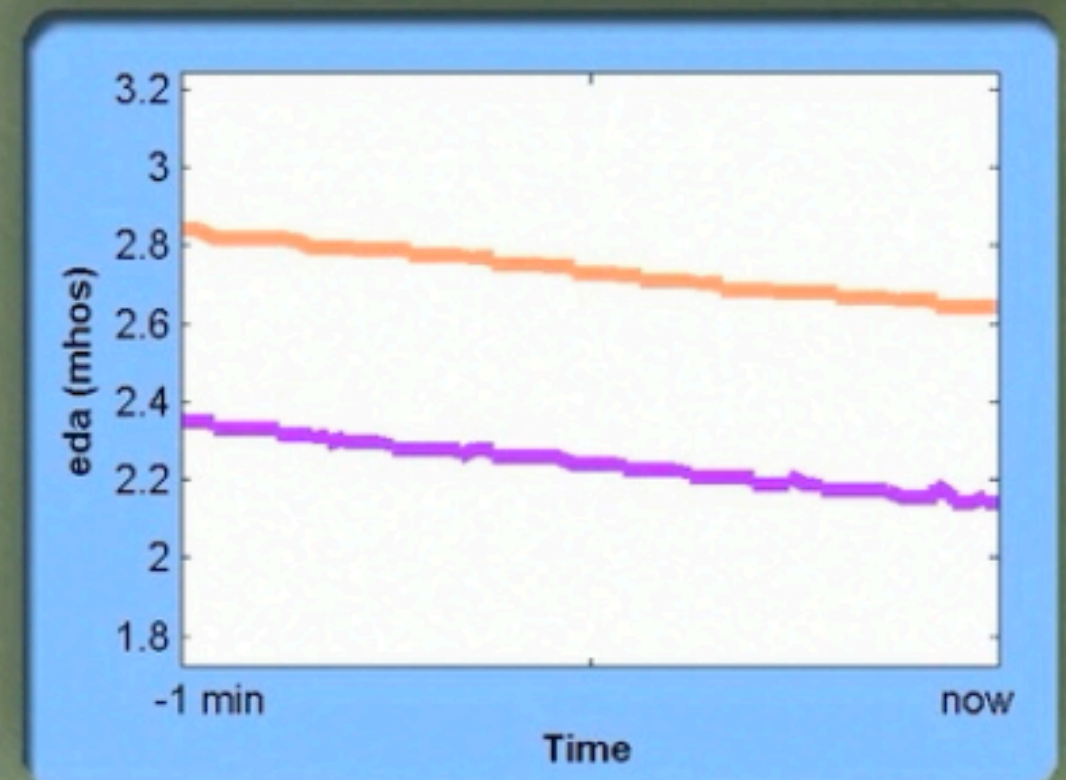


Media Lab
Innovations



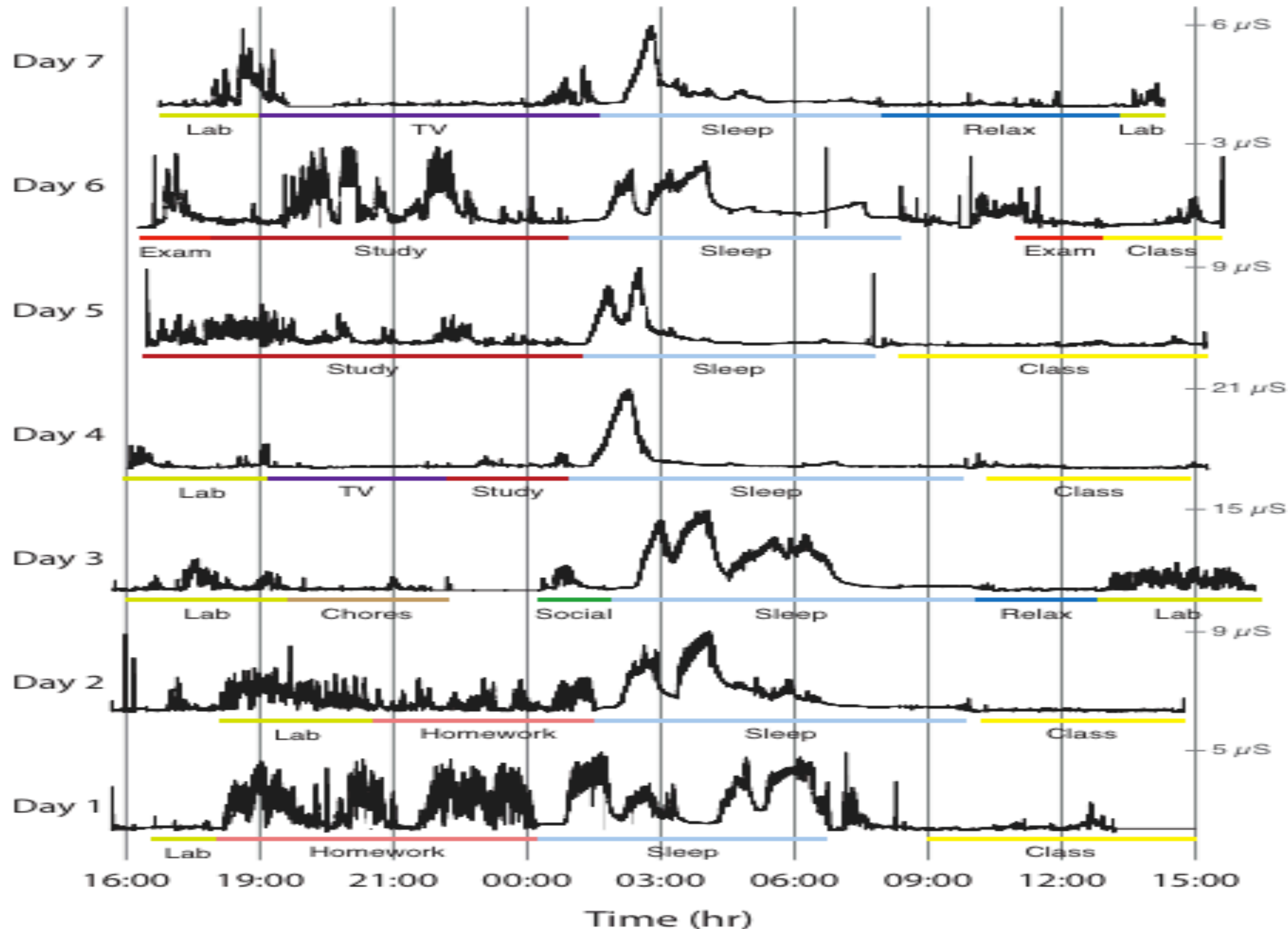
QTM Sensor,
Empatica E3p

Example: Measuring sympathetic nervous system response via electrodermal activity (EDA) on lower legs



Now we can log autonomic data – sympathetic nervous system response 24/7 “in the wild”

Electrodermal Activity, μS

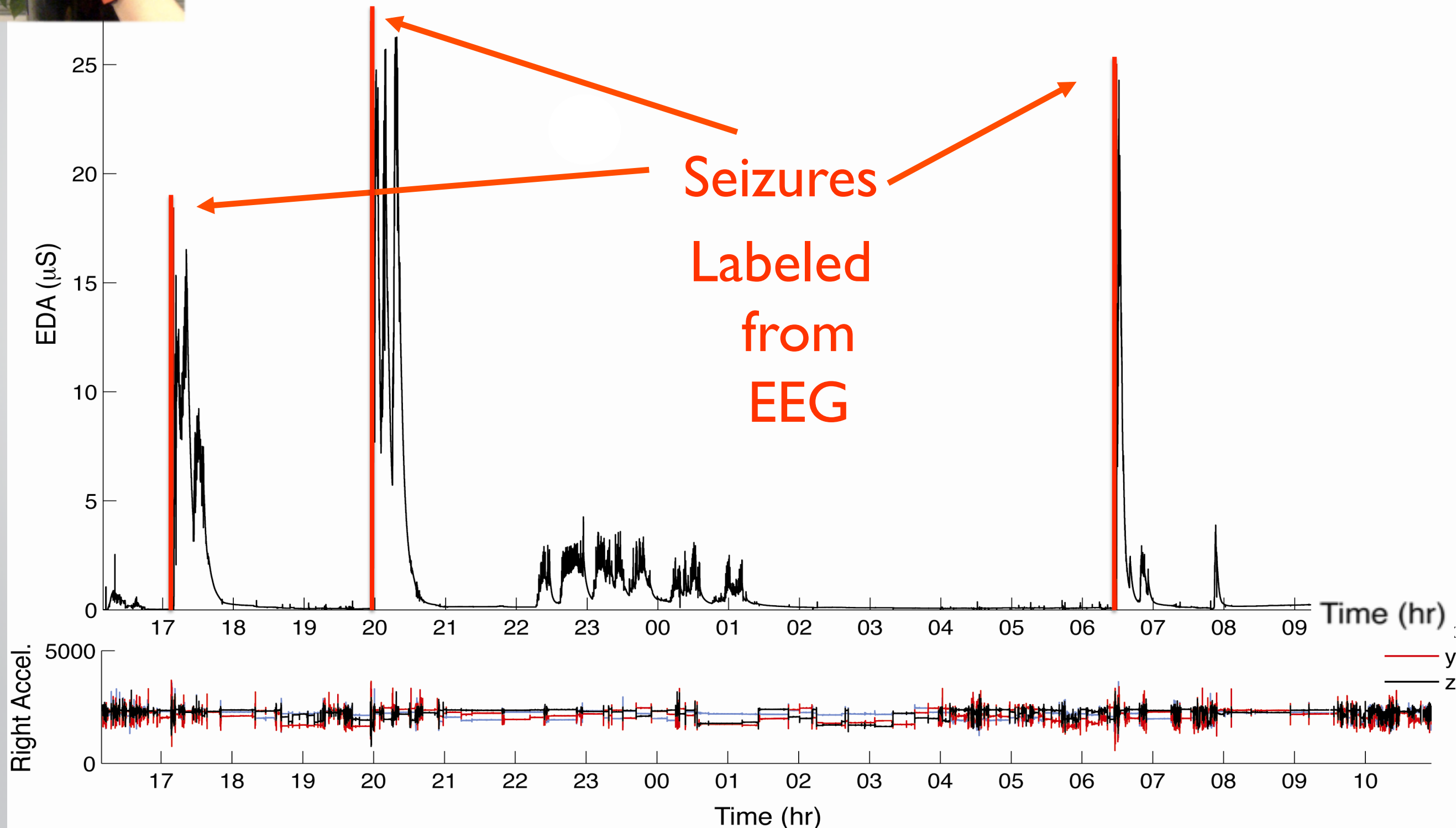


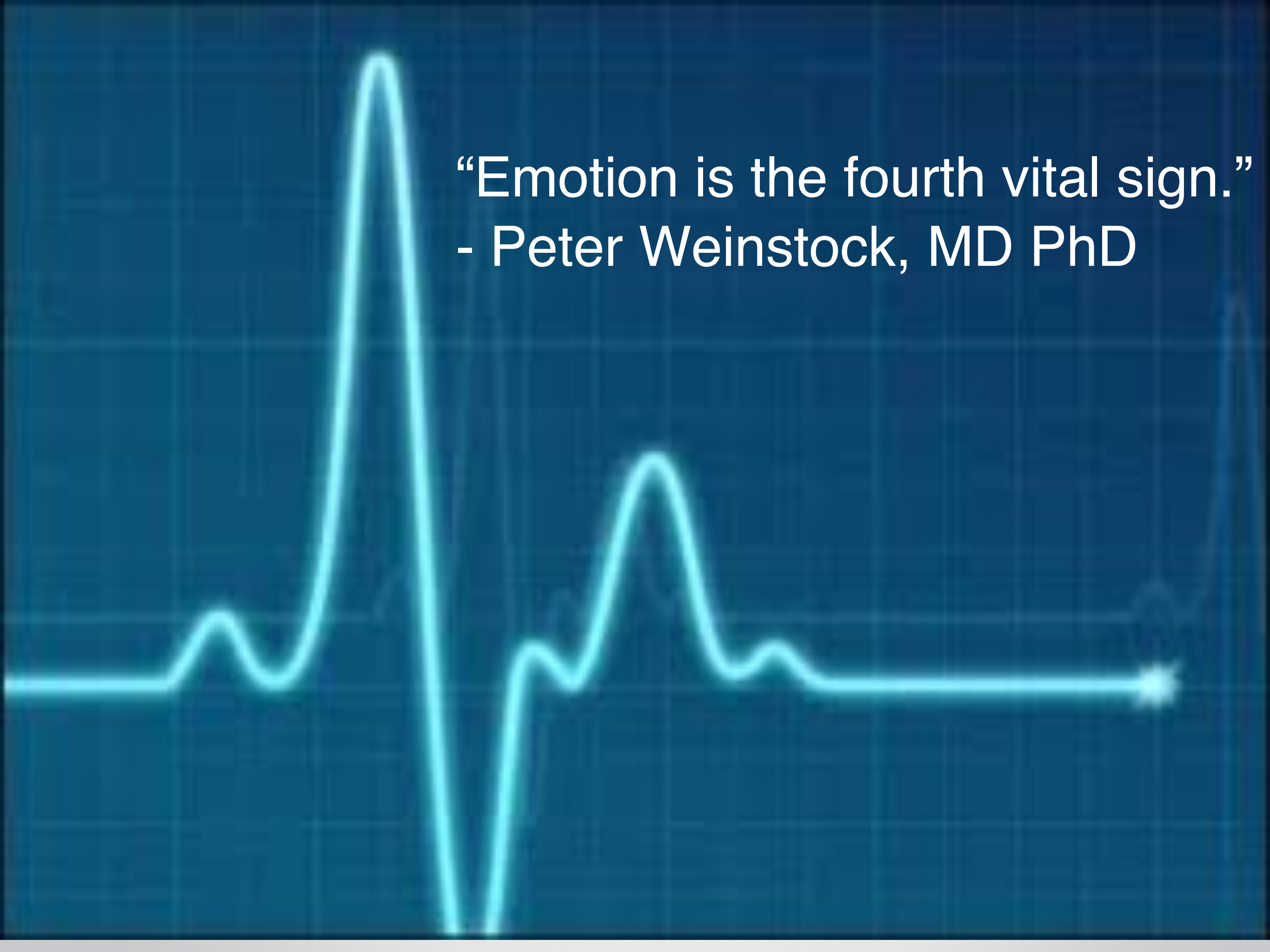
Wrist sensor data is best for determining who improved the most on a learning task



(compared EDA, sleep staging, actigraphy, and EEG: C3, C4, O1 and O2, 100Hz, $n=24 \times 3 = 72$ nights; Sano et al, BSN, 2013)

94% accurate convulsive seizure detection using
wrist electrodermal activity and accelerometry
Poh et al (2012), *Epilepsia*.

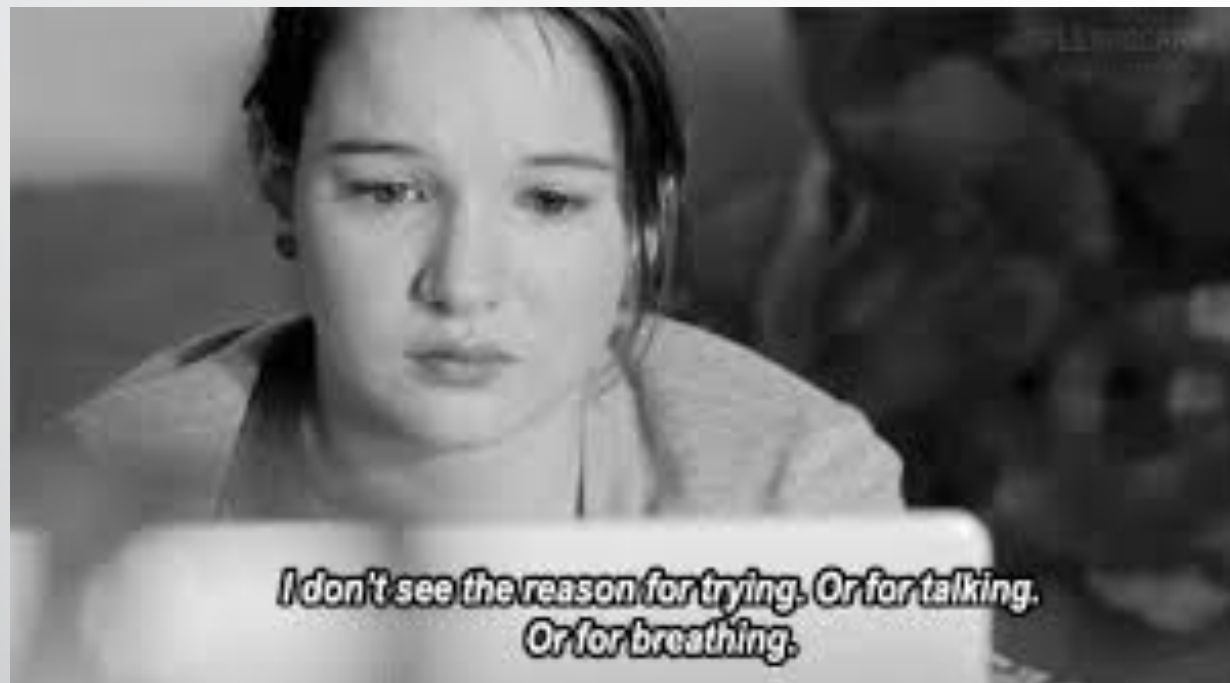


A glowing blue ECG line is plotted on a dark blue grid background. The line starts with a small peak, followed by a deep trough, then a very tall, sharp peak. After this, it shows a smaller peak, a slight dip, and then continues with smaller, more frequent oscillations before ending in a small, bright star-like point.

“Emotion is the fourth vital sign.”
- Peter Weinstock, MD PhD

Computational Empathy, and Preventing Cyber-bullying

With Karthik Dinakar and Henry Lieberman



Computational Empathy

Dinakar, K., Jones, B., Havasi, C., Lieberman, H., Picard, R.W., "Common Sense Reasoning for Detection, Prevention, and Mitigation of Cyberbullying", ACM Transactions on Interactive Intelligent Systems, Volume 2 Issue 3, September 2012.

Helping distressed teens through story matching


- Identify underlying emotional state information and topics using probabilistic graphical models
- Use parameters from the model to promote self-reflection in distressed teens by showing them similar stories from other teenagers.


MTV: <http://www.athinline.org/overtheline>

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Anonymous

Theres this guy who likes me and his bestfriend also has a crush on me and he gets rlly jelous of him bcuz i am closer with the bestfriend than with the other guy,hes always giving his bff dirty looks...is that crossing it?

YOUR RATING:
 **ON**
THE LINE

23%
RATED IT
 **OVER**
THE LINE.
MORE

++ COMMENTS (0) // SIMILAR STORIES >> SHARE



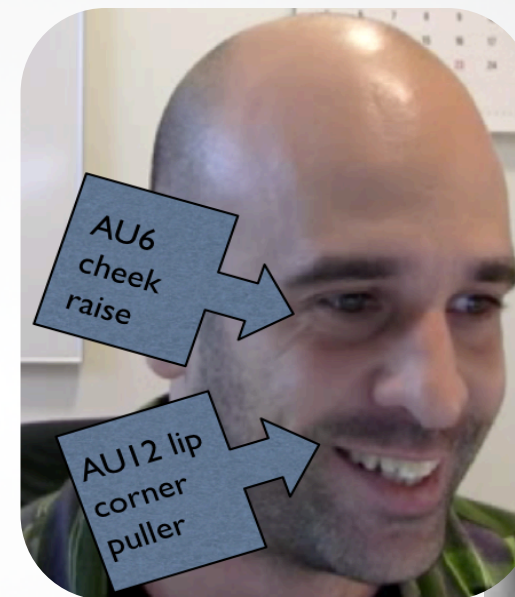
	% Strongly Agree		% Agree		% Strongly Disagree		% Disagree		% Neither agree nor disagree	
	LDA+	Control	LDA+	Control	LDA+	Control	LDA+	Control	LDA+	Control
Q1	45.0%	0%	22.1%	3%	15.9%	46%	17%	51%	0%	0%
Q2	35.3%	0%	23.0%	8.3%	15%	31.0%	13.2%	35.1%	12.5%	25.6%

Q1 ‘The themes of the story presented matched the themes of the story I wrote’

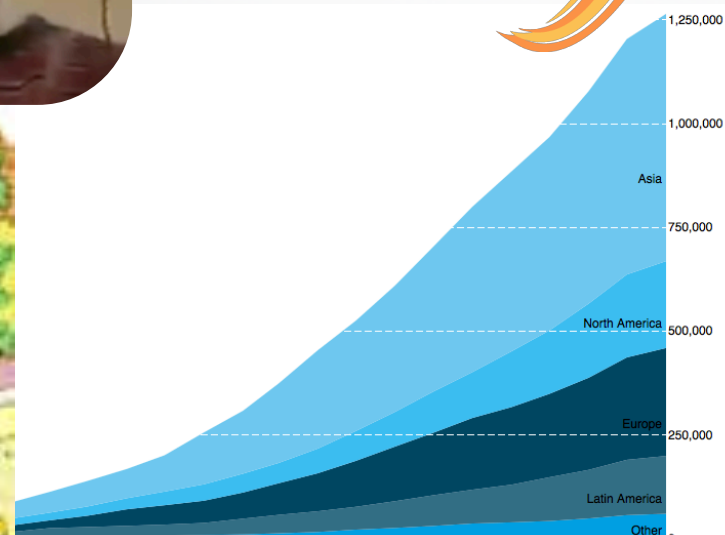
Q2 ‘After reading the presented story, I can imagine that someone in a similar situation would not feel alone’

Lieberman, H., Dinakar, K., Jones, B., "Crowdsourced Ethics With Personalized Story Matching", in the proceedings of the ACM SIGCHI Conference on Human Factors in Computing Systems, Paris 2013.

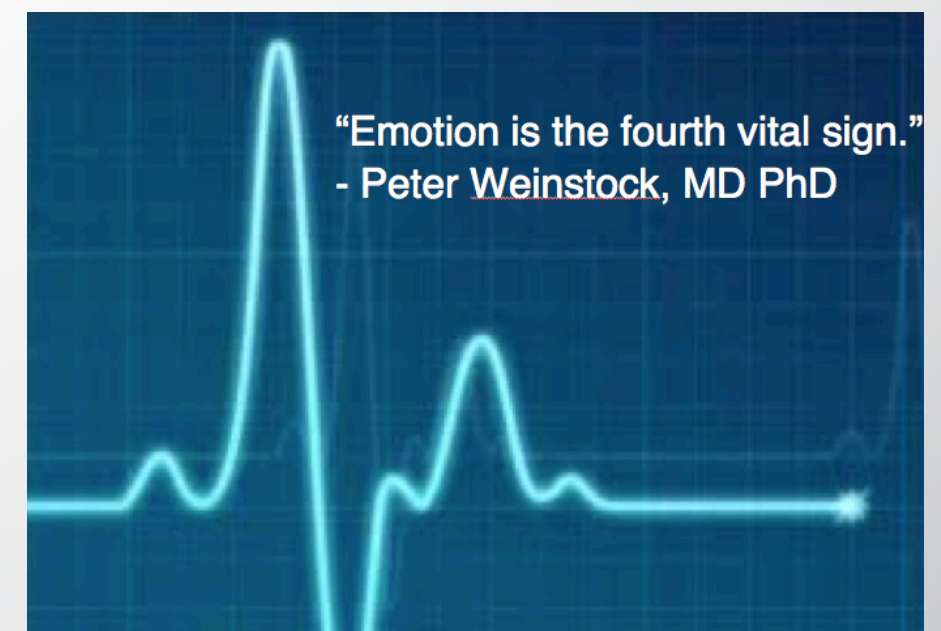
Adventures in Emotion Recognition: Face + Physiio + Text



affectiva



1B+ emotion points



Free software/publications:

<http://affect.media.mit.edu>

<http://affect.media.mit.edu/publications.php>

picard@media.mit.edu

Tweet #RosalindPicard

[Free SDK: affdex.com](http://affdex.com)

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