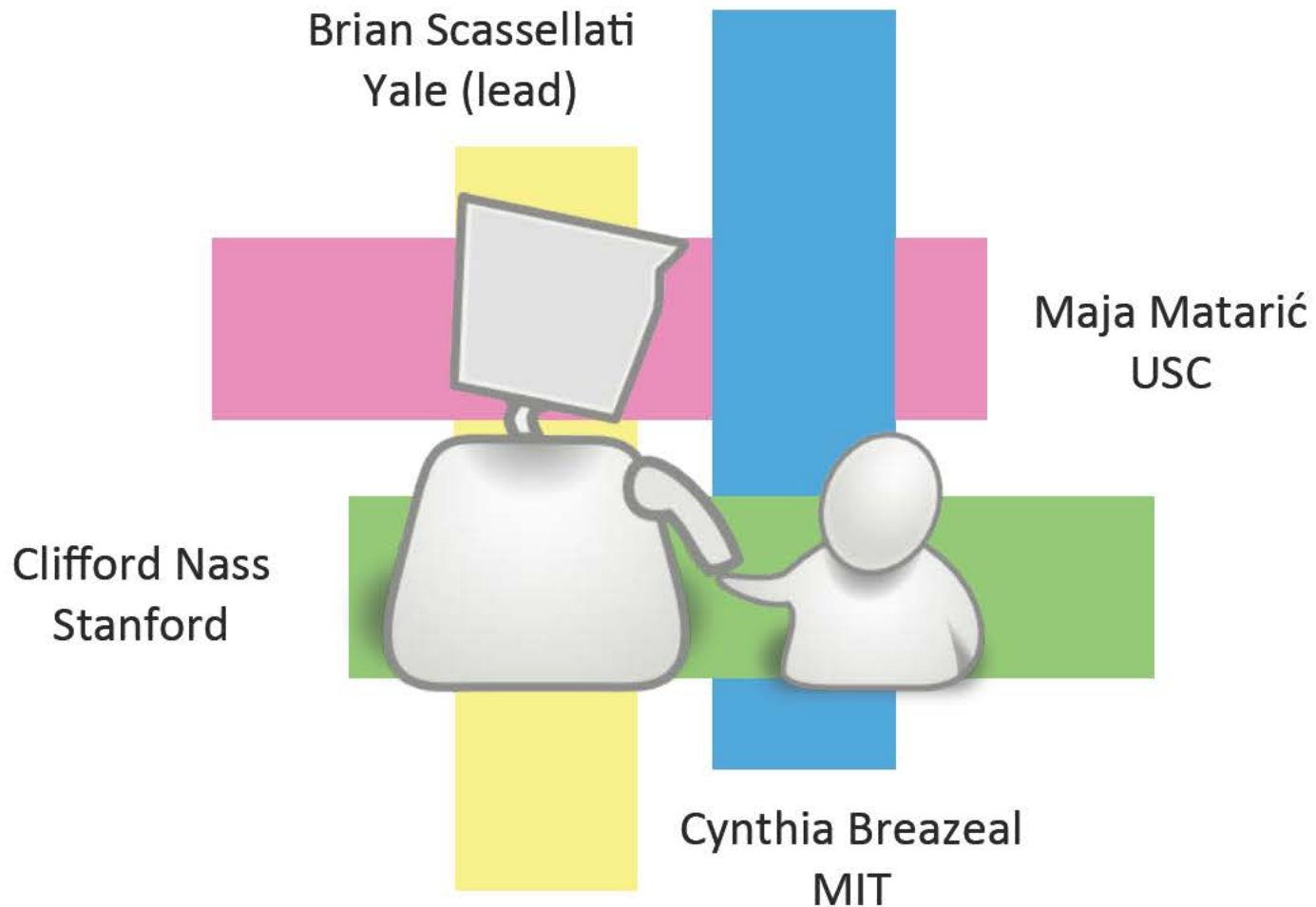


# Socially Assistive Robots

NSF Expedition in Computing PI meeting



# Vision

- To create socially assistive robots that supplement the efforts of educators, therapists, parents and clinicians to teach social, emotional, and cognitive skills to children, including those with social or cognitive deficits.

# Supporting Cognitive and Social Disabilities

- Social and cognitive deficits in children have quadrupled in the US in the last decade alone
- **Flexible interactions** need to adapt to the changing context
- Heterogeneous presentations; robot must be **personalized** to the child's strengths and deficits
- Engagements must progress as the child become more adept, over a period of **months to years**



Pleo engaging children with developmental disabilities @ Yale

# English Language Learning

- 20% of US school children are raised in homes where English is not the primary language
- Language learning is socially gated; **personal interaction** is essential
- Needs to adapt to **individual** vocabulary and concepts
- Requires **long-term** exposure and engagement over years for fluency



Dragonbot for language learning @ MIT

# Health Maintenance

- 17% (or 12.5 million) of children and adolescents in the US aged 2-19 years are obese
- Must **shape the interaction** to make it engaging, motivating, and effective
- Motivation techniques must be tailored to the **individual** child
- Social support is critical for **long-term** behavior change and adherence



Bandit providing exercise routines @ USC

# Expedition Vision

Imagine a robot that can ...

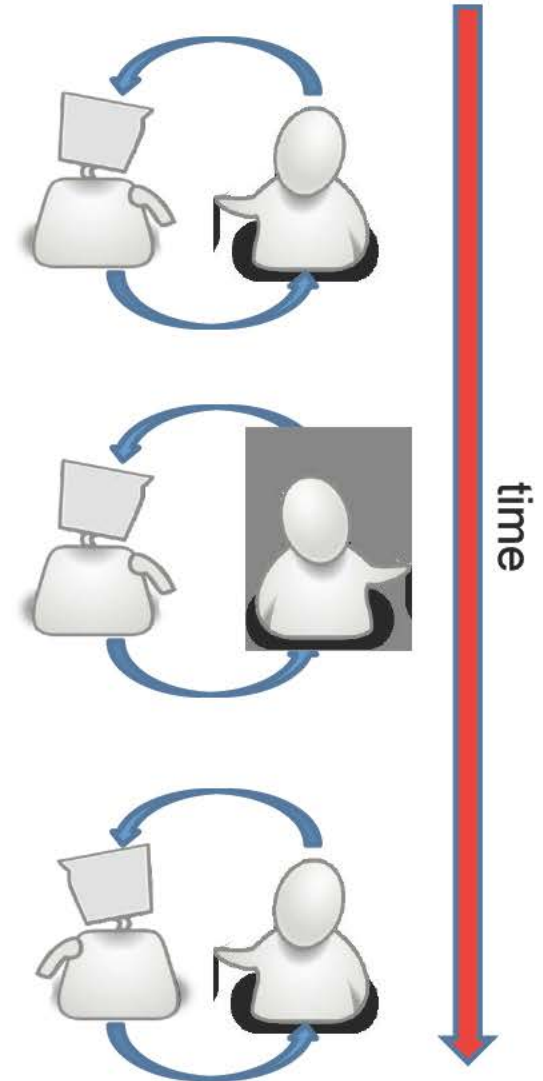
- ... guide the child toward **long-term** behavioral goals;
- ... be **customized** to the particular needs of the child;
- ... **develop and change** as the child does;
- ... **engage** the child **as a peer**, not as a parent, teacher, toy, or pet.

# Research Thrusts

- To achieve this vision, we need **transformative computational discoveries**
  - Models of the dynamics of social interaction
  - Algorithms for personalized assistive interactions
  - Framework for long-term guidance and support

# Models of the Dynamics of Social Interaction

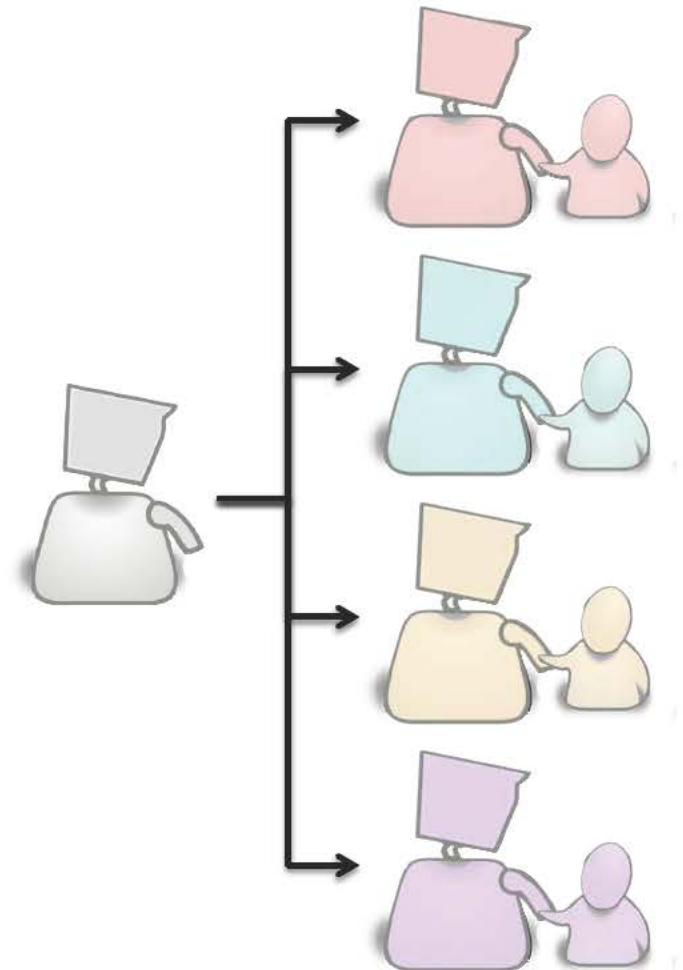
- State-of-the-art
  - In-the-moment social cue recognition
  - Brittle behavior selection
- New capabilities
  - Engage in dynamic interplay
  - Steer toward a behavioral goal
  - Leverage social information on trust, credibility, engagement from within the social dynamics





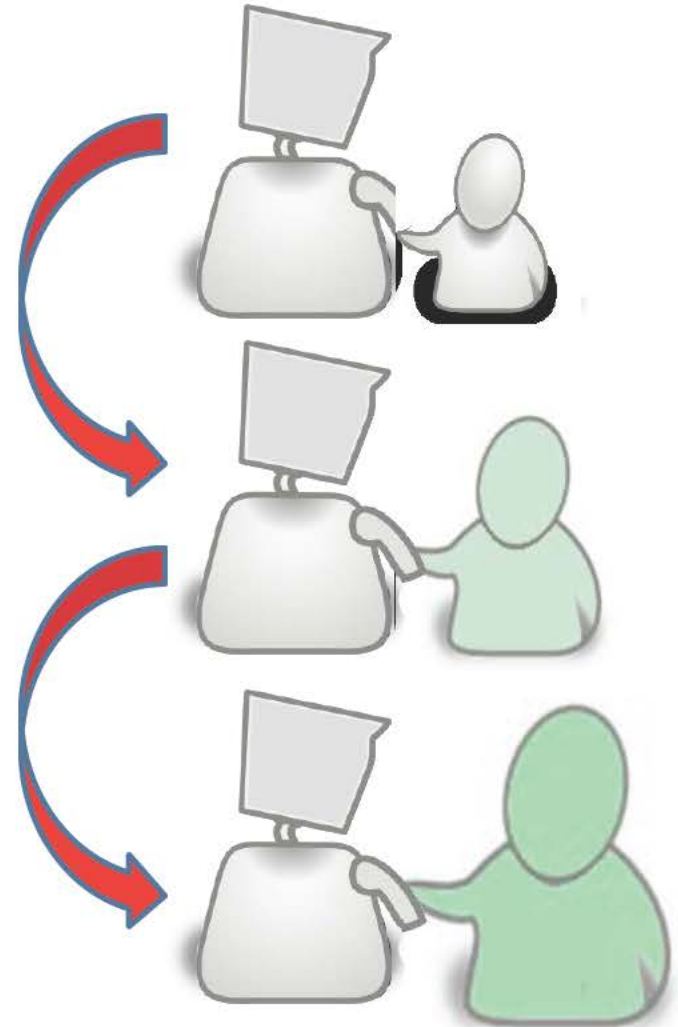
# Algorithms for Personalized Assistive Interactions

- State-of-the-art
  - User-choice or survey-driven personalization
  - Stationary and homogeneous training and testing
  - Recommender systems
- New capabilities
  - Continuous adaptation to individual differences
  - Goal-driven adaptation
  - Unique corpus of interaction data across a large population



# Framework for Long-Term Guidance and Support

- State-of-the-art
  - Few long-term social interactions
  - Template-driven responses
- New capabilities
  - System grows with the child (scaffolding)
  - Sustained motivation and engagement
  - Characterize of the evolution of interaction over time across a population



# SAR Core Research Team

## Robot Development Partners



Scassellati



Mataric



Breazeal

## Technology Partners



Sha



Dollar

## Outreach Partners



Resnick



Ragusa

## Evaluation Partners



Nass



Takayama

## Application Partners



Ackermann



Schwartz



Shic



Spruijt-Metz

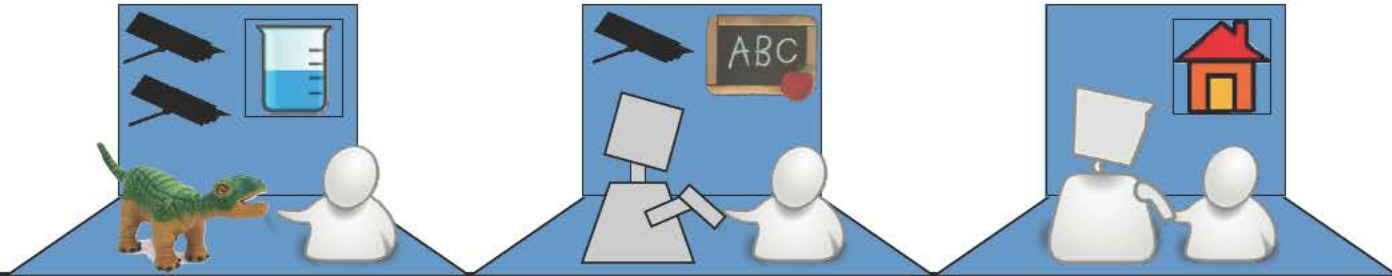


Volkmar

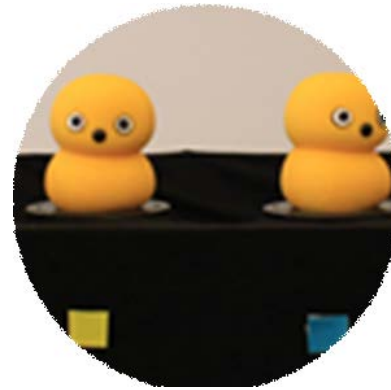


Wolf

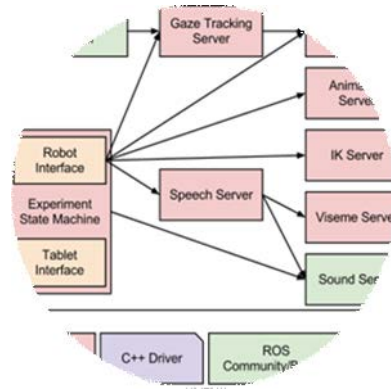
# Research Plan



	Year 1	Year 3	Year 5
<b>Deployment location</b>	Laboratory	Preschool classroom	Home
<b>Application domain</b>	Health maintenance	English language learning	Children with social deficits
<b>Type of robot</b>	Off-the-shelf	Research prototype	Replicated design
<b>Sensing &amp; computation</b>	Instrumented in room	Portable external sensing package	Self-contained within robot
<b>Behavioral scope</b>	Monitor one particular skill	Engage multiple target skills	Adapt as child's changing skill level
<b>Interaction length</b>	1 week	2 months	1 year
<b>Evaluation criteria</b>	Pleasant and engaging interaction	+ Adherence to an educational goal	+ Generalization to other interactions



# Year 1 Research Highlights



# Child-Robot behavior as a **Catalyst** for Child-Adult behavior



- Pre-encounter interview
- Robot encounter
  - “afraid of water”
  - Child prompted to provide appropriate prosodic intonation
- Post-encounter interview

**23 ASD + 12 TD controls (age 8-12 yrs),  
high-functioning (full scale IQ >70) , verbal, ASD diagnosis (ADOS, ADI-R)**

# Child-Robot behavior as a **Catalyst** for Child-Adult behavior



# Child-Robot behavior as a **Catalyst** for Child-Adult behavior



more *face-to-face orientation* to the interviewer  
(paired one-sided t-test,  $p = .03$ )

more *relevant statements* to an interviewer's personal story  
(paired t-test,  $p=0.004$ )

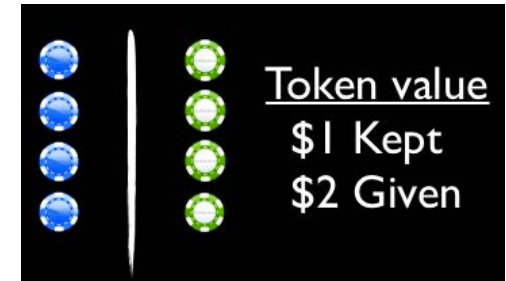


# Computational Models of Trust



## Task:

- 1) 5-minute conversation
- 2) Give-Some-Game

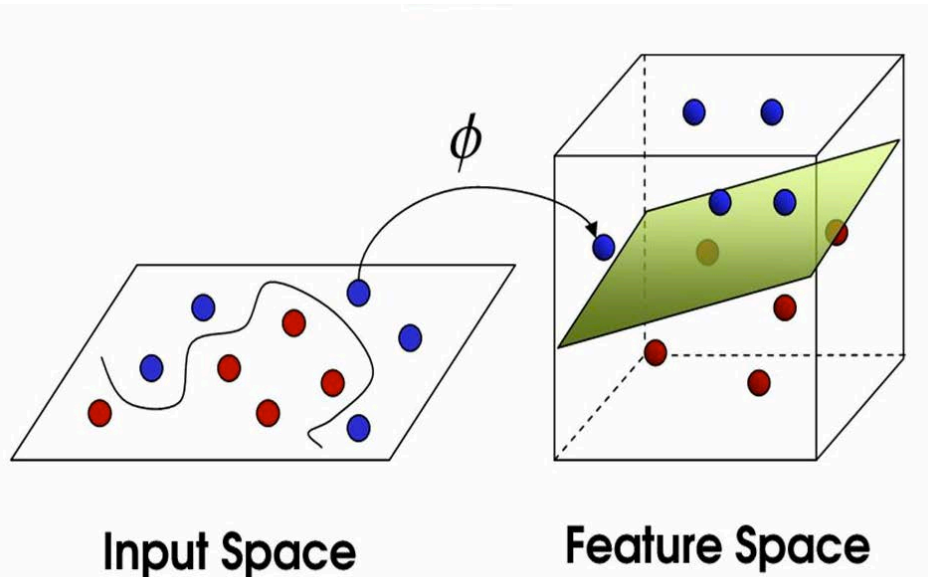


## Data:

- Video data
- Nonverbal coding
- Trust measurements

- 56 dyadic interactions or 112 individuals
- Undergraduates at Northeastern University
- 31% male and 69% female.

# Computational Models of Trust



## Feature Extraction

I. Counts, durations, means of the 4 trust-related gestural cues

- cross arms, touch hand, touch face, lean away

II. Temporal features by encoding templates looking for certain patterns of emitted gestures

III. Features derived for both participant and their partner along with their differences

## Support Vector Machines

- high dimensional properties
- success in prior works
- off-the-shelf classifier

# Computational Models of Trust

## Classification Results

model	description	Mean prediction error	t-test
svm	rbf kernel nested LOOCV	<b>0.73</b>	---
random	randomly guesses 0,1,2,3,4 tokens	<b>1.24</b>	$p < \mathbf{0.0000003}^*$
human	human judgement	<b>1.00</b>	$p < \mathbf{0.0004025}^*$
a priori	always guesses 2 tokens	<b>0.83</b>	$p < \mathbf{0.0144585}^*$

SVM model significantly outperforms all baselines

\*Wilcoxon's Signed Rank test with a Bonferroni correction of  $p < .0166$  for significant difference

# Year 1 Demonstration

- Nutrition training interaction
- 1st grade students
- Integrates:
  - Hardware from MIT
  - Software from Yale
  - Experimental design from USC
  - Evaluation mechanisms from Stanford
- Autonomous interaction flow, but with tele-operated perception and dialog selection



# Year 1 Demonstration

- 4-week long, twice-weekly intervention
- Each week focuses on a different education goal
  - Choosing whole grains and non-sugary drinks for lunch
  - Choosing healthy after-school snacks
  - Choosing healthy cereals and a balanced breakfast
  - Choosing colorful vegetables as sides at dinner
- 1<sup>st</sup> day with robot as expert, 2<sup>nd</sup> day for collaborative problem solving



# Year 1 Demonstration



# Outreach

- Year 1:
  - Get kids into our labs
  - Get researchers into schools
  - Large-scale and hands-on events at multiple sites
- Years 2-5:
  - Social robot toolkit
  - Curricular materials
  - Evaluation program



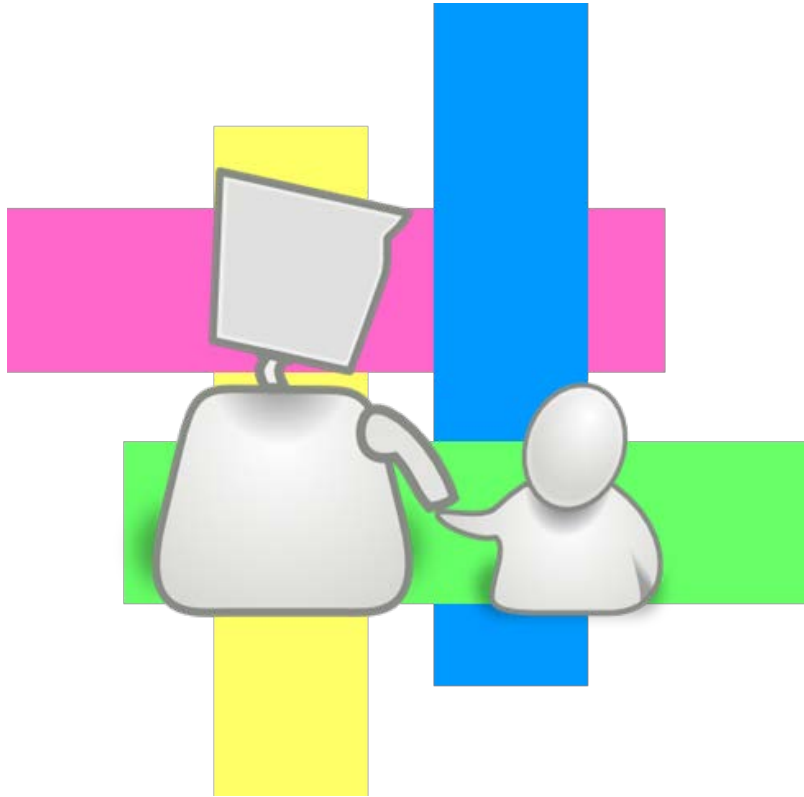
# Outreach





# Socially Assistive Robots

An NSF Expedition in Computing



- Present for PI meeting:
  - Brian Scassellati (Yale, PI)
  - Maja Matarić (USC, co-PI)
  - Cynthia Breazeal (MIT, co-PI)
  - David Feil-Seifer (Yale, NSF CI Fellow)
  - Henny Admoni (Yale, graduate student)

[www.RobotsHelpingKids.org](http://www.RobotsHelpingKids.org)