



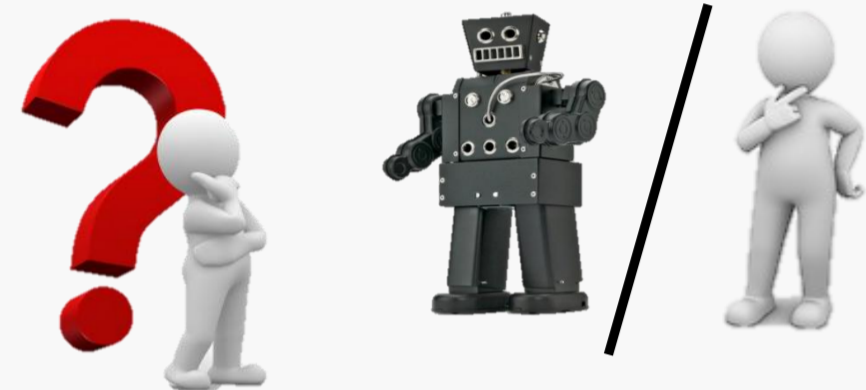
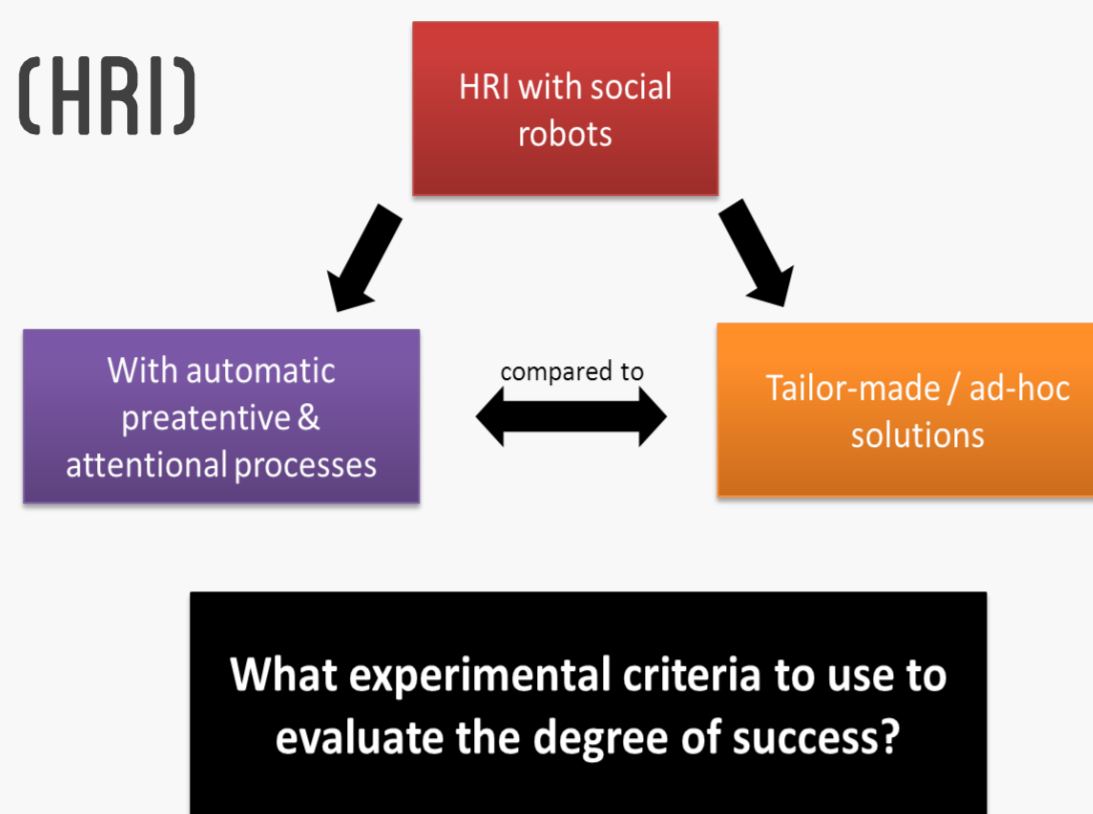
# EVALUATING THE INFLUENCE OF AUTOMATIC ATTENTIONAL MECHANISMS IN HUMAN-ROBOT INTERACTION



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## EVALUATING HUMAN ROBOT INTERACTION (HRI)

The hypothesis is that using automatic attentional mechanisms as a basic block for posteriorly build a robotic cognitive intelligence is the correct approach and, in order to experimentally prove it, we propose a systematic evaluation method.



Turing test for social skills

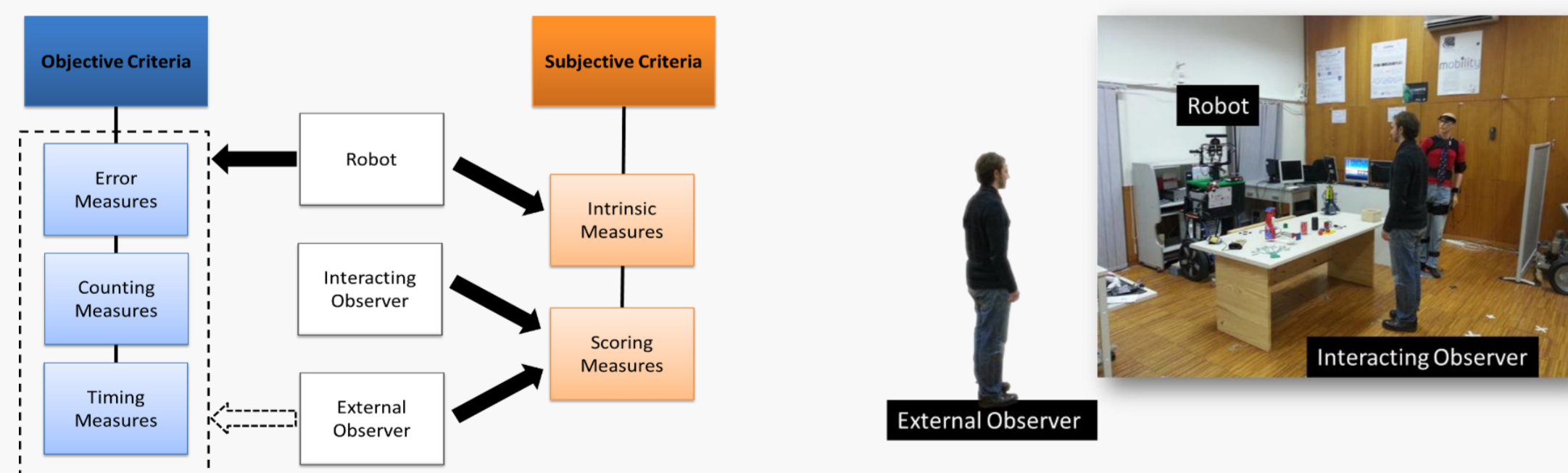
systematic evaluation criteria

HRI benchmarking

Social Compliance Score (SCS) as an unique value to evaluate the robot behavior.  $X$  is the SCS of using attentional process and  $Y$  is the SCS of using a tailor -made solution, then we state:

$$H_0: X > Y \rightarrow \text{attention mechanisms better than tailor - made for HRI}$$

## OBSERVERS



## ROBOT CLASS DEPENDING ON ITS CAPABILITIES

- A robots capable of gaze-shifts and fixation (e.g. active head)
- B robots with speech capabilities. B1 speech recognition and B2 able to talk
- C robots with arms and pointing or showing capabilities
- D robots with emotional capabilities

## JOINT ATTENTION AS THE REFERENCE FRAME

## CRITERIA

Evaluation bridge conventional objective measures from robotics with subjective criteria from human studies in psychology and neuroscience.

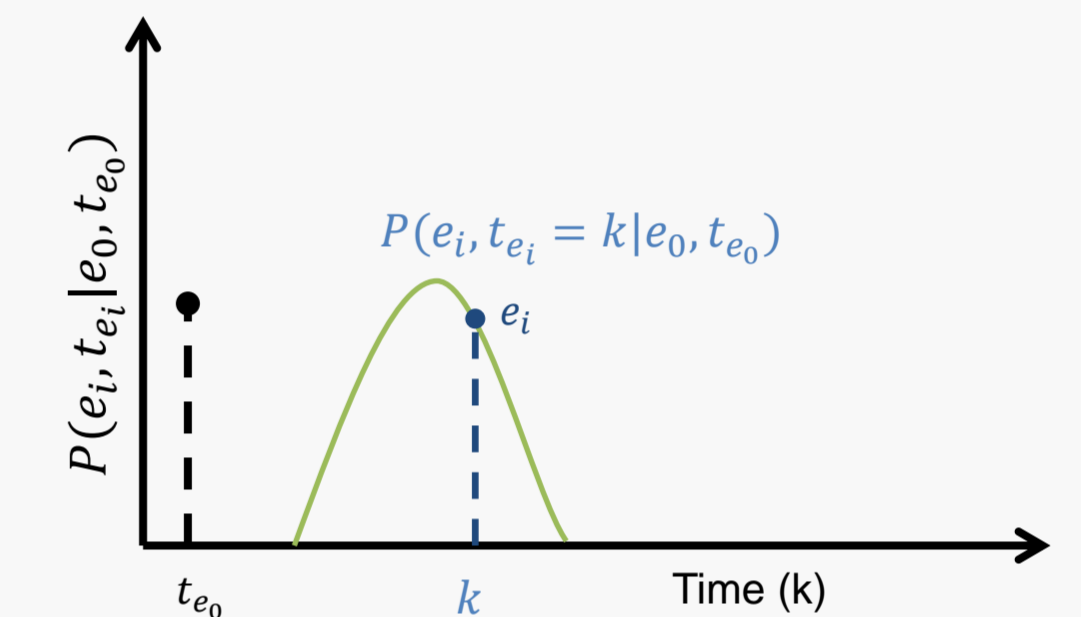
### Objective

Items	ID	Robot Class
<b>Qualitative Criteria in Reciprocal Social Interaction</b>		
<b>Engaging and Joint Attention</b>		
Interlocutor detection error	RS11	A
Robot engaging delay after human IJA	RS12	A
Disengaging delay after human pointing or gazing	RS13	A
Object search latency	RS14	A
Acknowledging joint attention period or cycle	RS15	A
#Engages	RS16	A
#Disengages	RS17	A
#Robot initiating joint attention (IJA)	RS18	A
#Pointing events	RS19	C
#Showing events	RS110	C
Looking at people frequency	RS111	A
Object detection success	RS112	A
Joint attention error	RS113	A
Turn taking coherence (IJA switching)	RS115	A
<b>Social-emotional reciprocity</b>		
Expressions towards interlocutors rate	RS116	D
Frequency of contact (touching)	RS117	C / CD
<b>Restricted, Repetitive Behaviors and Interests</b>		
Contingent stimulus attention error	RB1	A / B / D
Time to attend novel contingent multimodal stimulus	RB2	A / B / C / D
Head movements per second	RB3	A
Social delay error	RB4	A / B / C / D
<b>Qualitative impairments Communication and Language</b>		
Utterances rate per interlocutor	CL1	B1
Name hearing error	CL2	B1
Frequency of vocalization directed to others	CL3	B2
<b>HRI performance metrics</b>		
Reciprocal Social Interaction	$R_s$	-
Behaviors and Interests	$B_s$	-
Communication and Language	$C_s$	-

### Subjective

Items	ID	Robot Class
<b>Qualitative Criteria in Reciprocal Social Interaction</b>		
<b>Engaging and Joint Attention</b>		
Unusual eye contact	JA1	A
Low frequency of looking at people	JA2	A
Spontaneous initiation of joint attention	JA3	A / B2
Pointing	JA4	C
Showing	JA5	C
Looking at object	JA6	A
Acknowledging joint attention	JA7	A / B2 / C
Social reward		
Shared enjoyment	SR1	D
<b>Social-emotional reciprocity</b>		
Facial expressions directed to others	ER1	D
Quality of social overtures	ER2	D
Use of other's body to communicate	ER3	C / CD
<b>Restricted, Repetitive Behaviors and Interests</b>		
Repetitive interests and behaviors	RB1	A / B / C / D
Unusual sensory behaviors or interest	RB2	A / B / C / D
Overactivity	RB3	A / B / C / D
Negative behavior and distraction	RB4	A / B / C / D
Slow behavior	RB5	A / B / C / D
<b>Qualitative impairments Communication and Language</b>		
Conventional gestures	CL1	A / C
Response to name	CL2	B1
Frequency of vocalization directed to others	CL3	B2
Immediate echolalia	CL4	B2
Speech abnormalities	CL5	B2
<b>HRI performance metrics</b>		
Reciprocal Social Interaction	$R_s$	-
Behaviors and Interests	$B_s$	-
Communication and Language	$C_s$	-

## EXPECTED BEHAVIOR



Subjective scores should be correlated with the objective measures.

The expected behavior can:

- Be learned from human data
- Be used as an error function criteria by comparison with the real robot behavior

## SOCIAL COMPLIANCE SCORE

$$\text{Objective (O)} = \{R_o, B_o, C_o\}$$

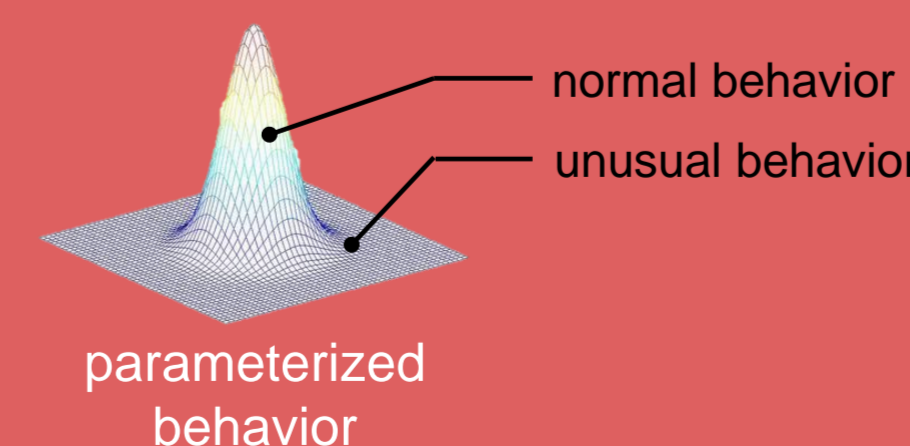
$$\text{Subjective (S)} = \{R_s, B_s, C_s\}$$

- Reciprocal social interaction
- Behaviors and Interests
- Communication and language

$$\text{SCS} = P(\text{human} | [O, S], \Theta)$$

- One-Class classification
- Anomaly detection

[Tax 2001, Chandola 2009]



## REFERENCES

- Tax, D. M. J. (2001), 'One-class classification: Concept learning in the absence of counter-examples', PhD thesis, Technische Universiteit Delft.
- Chandola, V., Banerjee, A., Kumar, V. (2009). 'Anomaly detection: A survey'. ACM Comput. Surv.

