

# TrustE - An Emotional Trust Model for Agents

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# Summary

- Motivation
- Proposal
- Regret Model
- Emotions in agents
- The TrustE Model
- Final Considerations

- The study and modeling of trust has attracted the interest of researchers in several areas
- In Computer Science this interest is mainly in the Multiagent Systems (MAS) area
- Trust and reputation in MAS are essential, providing effective interaction among agents
- Several models of trust and reputation has been developed in the area
  - Regret, Travos, Fire, among others

- The models found in the literature are based on algebraic analysis to determine the act of trust, which makes such models essentially mathematical and disconnected from the agent's history
- For humans, emotions directly influence the act of trust, imposing a subjective evaluation of trust

Put together emotions and trust in order to achieve a human like behavior

- Emotions are incorporated as symbolic evaluations that are related with the context in which the agent is embedded

Regret + Emotions = TrustE Model

## Overview

- Reputation model based on 3 dimensions:
  - Individual dimension
  - Social dimension
  - Ontological dimension
- Distributed architecture
- Each agent has its own opinion about the others
- The *Outcome* of a dialogue between two agents is:
  - The initial contract that defines the terms and conditions of a transaction between two agents
  - The result of the actions taken in this transaction

## Individual dimension

- Individual reputation of agent (IR)
- Calculated directly from the agent impressions database
- Weighted Average - more recent Impressions have greater weight

$$R_{a \rightarrow b}(\varphi) = \sum_{t_i \in IDB_p^a} \rho(t, t_i) \cdot W_i \quad (1)$$

## Social dimension

- Social reputation of agent (SR)
- Social reputation takes into account three sources of information to calculate reputation:
  - 1 The interaction of the agent *a* (evaluator) with other members of the group that the agent *b* (rated) belongs.
  - 2 What members of the group *A* (the *a* agent group) think about the agent *b*.
  - 3 What members of the group *A* think about the group *B* (the *b* agent group).



# Regret model

## Social dimension - Source 1

$$R_{a \rightarrow B}(\varphi) = \sum_{b_i \in B} \omega^{ab_i} \cdot R_{a \rightarrow b_i}(\varphi) \quad (2)$$

$$* \sum_{b_i \in B} \omega^{ab_i} = 1.$$

## Social dimension - Source 2

$$R_{A \rightarrow b}(\varphi) = \sum_{a_i \in A} \omega^{a_i b} \cdot R_{a_i \rightarrow b}(\varphi) \quad (3)$$

$$* \sum_{a_i \in A} \omega^{a_i b} = 1.$$

## Social dimension - Source 3

$$R_{B \rightarrow B}(\varphi) = \sum_{a_i \in A} \omega^{a_i B} \cdot R_{a_i \rightarrow B}(\varphi) \quad (4)$$

$$* \sum_{a_i \in A} \omega^{a_i B} = 1.$$

## Final value of reputation

$$SR_{a \rightarrow b}(\varphi) = \xi_{ab} \cdot R_{a \rightarrow b}(\varphi) + \xi_{aB} \cdot R_{a \rightarrow B}(\varphi) + \\ \xi_{Ab} \cdot R_{A \rightarrow b}(\varphi) + \xi_{AB} \cdot R_{A \rightarrow B}(\varphi) \quad (5)$$

$$* \xi_{ab} + \xi_{aB} + \xi_{Ab} + \xi_{AB} = 1.$$

# Emotions in agents

- In recent years the study of emotions is present in research in AI and Computer Science
- Today it is widely accepted among psychologists that emotions play an important role in cognitive actions
- Psychological models of emotions are proposed mainly in terms of cognitive states and processes such as beliefs and actions selections

## OCC Model

- OCC model (Ortony, Clore and Collins) describes a hierarchy that classifies 22 types of emotions
- Specifies the conditions that trigger the emotions and the variables that affect the intensities of these emotions
- Examples of motions described in the OCC model:
  - *joy* - *pleased* about a desirable event;
  - *fear* - *displeased* about the prospect of an undesirable event;

## Intensity of Emotions

- The *intensity function* of an emotion can be represented by:

$$I_a(E, t) = \max(0, P_a(E, t) - L_a(E, t)) \quad (6)$$

- $P_a(E, t)$  represents the *potentiality* of emotion  $E$  of the agent  $a$ .
- $L_a(E, t)$  the *thresholds* of  $E$  of the agent  $a$ .
- $t$  the current time.

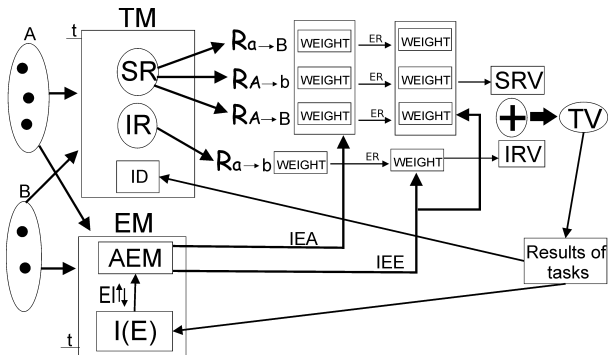
## Presentation

- TrustE adds emotions to the calculation of trust and reputation in agents
- The proposed model incorporates to the trust model estimates derived from symbolic reasoning, making the act of trust more dynamic and dependent on the agent's history
- It is done by the incorporation of emotional factors in the Regret model - the weights  $\omega$  and  $\xi$  of the Regret model are replaced by emotional symbols (*IEA* and *IEE* respectively)

## IEE and IEA

- *IEA* - Represents the *Intensity of Emotions triggered by Actions*
  - This group of emotions involves the emotions that are based on the judgment of an action's praiseworthiness.
- *IEE* - Represents the *Intensity of Emotions triggered by Events*
  - This group of emotions is related to the evaluation of an event with respect to the agent's goals.

# TrustE Model



Legends:

ER - Equations Results  
 TV - Trust Value  
 SR - Social Reputation  
 IR - Individual Reputation  
 ID - Impressions Database  
 EI - Emotion Intensities  
 t - time ● Agent

TM -Trust model  
 EM - Emotion model  
 IEA- Intensity of Emotions-Actions (admiration)  
 IEE - Intensity of Emotions-Events (joy)  
 I(E) - Intensity Functions of Emotions  
 AEM - Agent's Emotional Memory



## Regret equations in TrustE

- The first weight used in the calculation of Individual Reputation,  $R_{a \rightarrow b}(\varphi)$ , is the same used in Regret, which assigns higher values to the ratings given recently.
- The first weights in Social Reputations,  $R_{a \rightarrow B}(\varphi)$ ,  $R_{A \rightarrow b}(\varphi)$  and  $R_{A \rightarrow B}(\varphi)$ , are calculated from *IEA*.
- In the next step the weights used in  $SR_{a \rightarrow b}(\varphi)$  take into account the *IEE*.
- The four values of reputations are combined to form the Trust Value (*TV*).

## Regret equations in TrustE

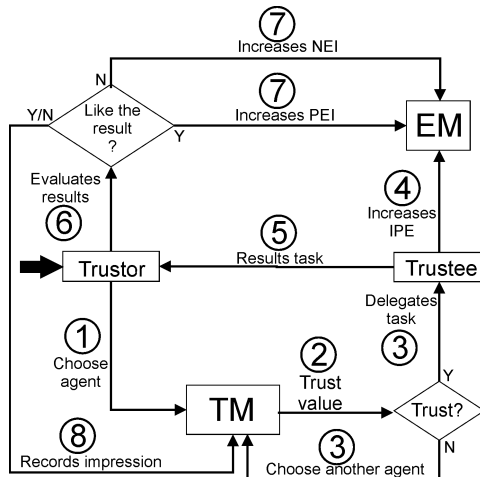
$$R_{a \rightarrow B}(\varphi) = \sum_{b_i \in B} IEA^{ab_i} . R_{a \rightarrow b_i}(\varphi) \quad (7)$$

$$R_{A \rightarrow b}(\varphi) = \sum_{a_i \in A} IEA^{a_i b} . R_{a_i \rightarrow b}(\varphi) \quad (8)$$

$$R_{A \rightarrow B}(\varphi) = \sum_{a_i \in A} IEA^{a_i B} . R_{a_i \rightarrow B}(\varphi) \quad (9)$$

$$SR_{a \rightarrow b}(\varphi) = IEE_a^{RI} . R_{a \rightarrow b}(\varphi) + IEE_a^{RS} . R_{RS} \quad (10)$$

# TrustE Model - Conceptual View



Legends:

TM - Trust model  
EM - Emotion model

PEI - Positive emotions intensity  
NEI - Negative emotions intensity

## Example:

Given a scenario in which a agent wants buy a product of good quality

- 1 *a* is a buyer agent that will choose an seller agent *b* among all the knowed sellers
- 2 *a* calculates the trust in *b*
- 3 If the trust value is low, *a* will looking for another seller, if it is high, *a* will buy the product from *b*
- 4 After has received the trust of *a*, *b* increases its positive emotions

## Example:

- ⑤ After some time, *b* will delivery the product to the agent *a*.
- ⑥ *a* will evaluate the product quality
- ⑦ If the quality is good, the positive emotions of *a* will increase. Otherwise, the negative emotions of *a* will increase
- ⑧ Finally *a* will evaluate, positively or negatively, the agent *b*.

# Final Considerations

- TrustE model aims to capture the complexity of human reasoning and turn it flexible quantitative evaluations by introducing elements of a qualitative nature
- The inclusion of emotions and their intensities can provide greater realism to the trust model
- The decision-making processes becomes directly related to the emotional state of the agent
- The proposed model can be further expanded to include a greater number of emotions
- The model needs to be implemented and validated in scenarios of negotiation among agents.