

# Bounded Practical Social Reasoning in the ESB Framework



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## ABSTRACT

Each agent in a multi-agent system will have its own goals and methods of reasoning about what actions to take. For an individual agent, reasoning about others is often a complex process. The Expectation-Strategy-Behaviour (ESB) framework provides an intuitive graph-based method to represent and simplify reasoning.

This poster introduces ESB through a simple example based on the card game Rummy, then presents one way in which the ESB design allows for simpler agent reasoning, and a simpler implementation.

## THE EXAMPLE

Cards provide a good domain, as an opponent's strategies are known, but defined by the unknown cards they hold - an intuitive example of reasoning about another agent. Here we show a model of an opponent's reasoning during a game of Rummy, specifically that surrounding the pickup of a  $2\heartsuit$ . The other agent is assumed to be collecting a run (e.g.  $2\heartsuit, 3\heartsuit, 4\heartsuit$ ) or a set (e.g.  $2\heartsuit, 2\clubsuit, 2\spadesuit$ ).

## EXPECTATIONS

An **expectation (E)** is a **conditional (C) belief ( $\Phi$ )** regarding a statement whose truth status will be eventually **verified** by a **test (T)** and **reacted (p)** on by the agent who holds it. **Table 1** below shows the expectations for this example. Tests are split into + and - events that confirm or disappoint the expectation. **Responses ( $\rho^+, \rho^-$ )** add or remove expectations.

Consider agent A expecting agent B to execute some action upon promising to do so. The expected belief is "B will perform an action ( $\Phi$ ) if he has promised to do so (C)". The test (T) is observing the action or its consequences. The response might be A rewarding B if the promise is kept ( $\rho^+$ ), or not ( $\rho^-$ ); or, the expectation itself might be modified, for example altering the level of trust towards B.

## STRATEGIES

The graph on the right is the **expectation graph**. The vertices are states containing active expectations, and the edges mark the transitions between states **specified by the responses (p)**. A **strategy** is a restriction of the graph based on current state. The highlighted portion shown is a **strategy applied to state 5** considering states to depth 1.

## BEHAVIOURS

1. Only discard a 2 if B is not collecting 2s.
2. Only discard a 3 if B is not collecting 3s.
3. Only discard cards I don't expect B to be collecting in the future.

**Behaviours** are "actions" linked to **conditions** on the **strategy graph**. Therefore, conditions are on current expectations and possible future expectations - those in states reachable from the current state according to the strategy graph. **For example, in state 5,  $E_{\Phi}^2$  is a possible future expectation.**

The above behaviour rules are fairly general - in particular the meaning of rule 3 is unclear. These rules can be translated into **explicit behaviour rules** conditioned on the expectations used in this example.

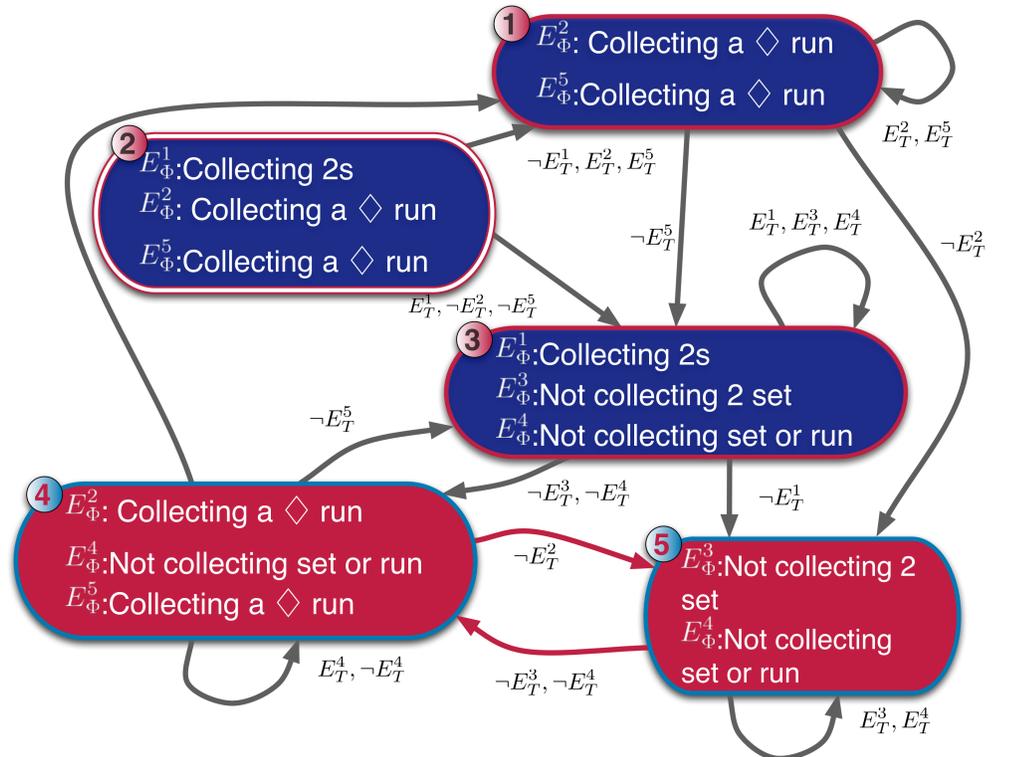
**Table 1: The agent's expectations. Initially it holds the set {1,2,5}.**

N	C	$\Phi$	T	$\rho^+$	$\rho^-$
1	B picked up $2\heartsuit$	B is collecting 2s	+(B picks up a 2) -(B ignores/discards a 2)	remove({2,5}) add({3,4})	remove({1})
2	B picked up $2\heartsuit$	B is collecting $\heartsuit$ run	+(B picks up member of $2\heartsuit$ run) -(B ignores/discards member of $2\heartsuit$ run)	remove({1,3,4}) add({5})	remove({2,5}) add({3,4})
3	B discarded $2\clubsuit$	B not collecting 2s	+(B ignores a 2) -(B picks up a 2)	-	remove({1,3}) add({2,5})
4	B ignored a 2	B not after 2s for run or set	+(B ignores a 2) -(B picks up a 2)	-	remove({1,3}) add({2,5})
5	B picked up $3\heartsuit$	B is collecting $\heartsuit$ run	+(B picks up another member of $3\heartsuit$ run) -(B ignores/discards member of $3\heartsuit$ run)	remove({1,3,4}) add({2})	remove({2,5}) add({1,3,4})

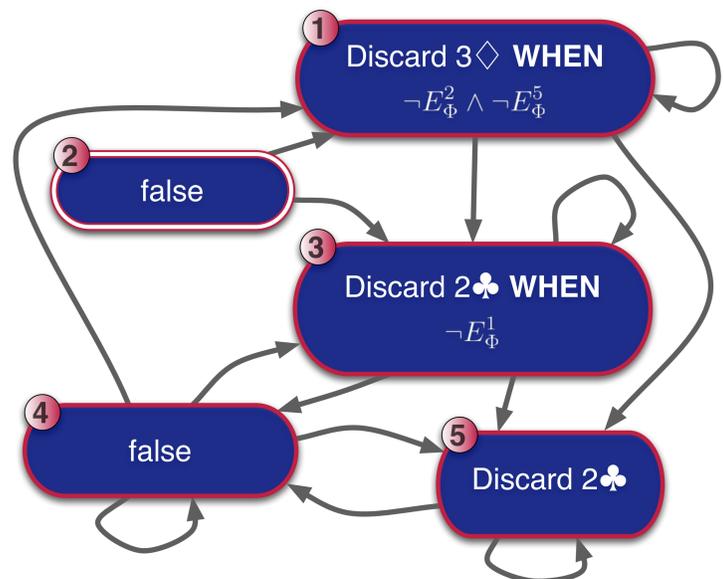
## Explicit Behaviour Rules

1. (a) Discard  $2\heartsuit$  if  $\neg E_{\Phi}^1 \wedge \neg E_{\Phi}^2 \wedge \neg E_{\Phi}^5$   
(b) Discard  $2\clubsuit$  if  $\neg E_{\Phi}^1$
2. Discard  $3\heartsuit$  if  $\neg E_{\Phi}^2 \wedge \neg E_{\Phi}^5$
3. (a) Discard  $2\heartsuit$  if in all accessible states  $\neg E_{\Phi}^1 \wedge \neg E_{\Phi}^2 \wedge \neg E_{\Phi}^5$   
(b) Discard  $2\clubsuit$  if in all accessible states  $\neg E_{\Phi}^1$   
(c) Discard  $3\heartsuit$  if in all accessible states  $\neg E_{\Phi}^2 \wedge \neg E_{\Phi}^5$

## An Expectation Graph



## SIMPLIFYING BEHAVIOURS



Behaviour conditions such as "in all accessible states" or "in some accessible states" could be expensive to check in large graphs. The application of a strategy to create the **strategy graph** reduces the problem, but does not eliminate it. One generalised technique that can be applied to bound agent reasoning (and thus simplify implementation) is to **re-write behaviour rules** to include state. The intuitive reasoning behind the algorithm used is that considering each behaviour in each state in turn, there are three possibilities:

1. The condition is always true.
2. The condition is always false.
3. In this state, some minimum combination of expectations decides the condition.

Pre-applying the behaviours with these rules gives **the simplified graph** above, where each state shows the behaviour rules that can apply.