



Institute for Systems and Robotics



Emotion-based Agents:
putting the puzzle together II

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- Overview

- Antonio Damasio: emotions are fundamental for appropriate decision-making

- long-term
 - without anticipating all possible consequences

- Somatic marker hypothesis

- sensory images associated with body states
 - “gut feeling”
 - hunches towards-to / away-from alternatives

- Cognition machinery evolved on top of emotion and regulatory mechanisms

- two intertwined levels

- Overview

- Anticipated emotions

- consequentialist

VS

- Anticipatory emotions

- brief changes in the body state
e.g., SCR



- Two levels of decision-making:

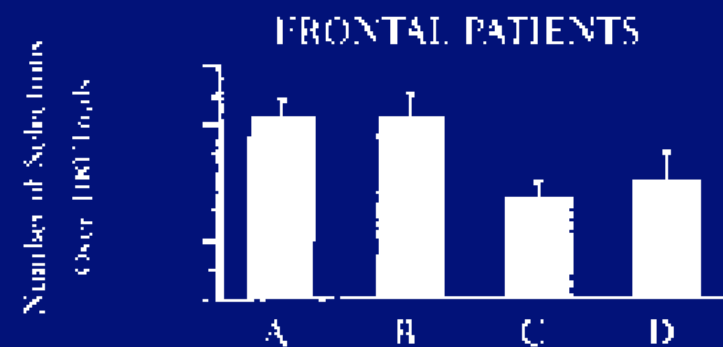
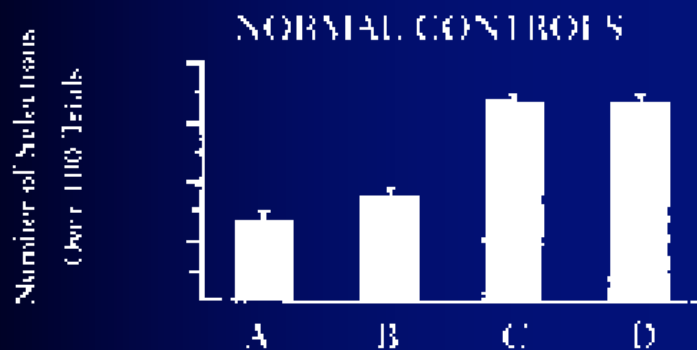
- cognitive – expected utility, outcome probability, rationality
 - emotional – insensitive to probabilities, anticipatory emotions, e.g. fears, panic, phobias, risk, gambling

- Examples

- 4 decks of cards: A, B, C, and D

- A, B – gain \$100, occasional high losses (\approx \$1250)

- C, D – gain \$50, occasional small losses ($<$ \$100)



- “future myopia”
- all showed SCR after punishment/reward
- only normal patients showed anticipatory SCR

- Examples

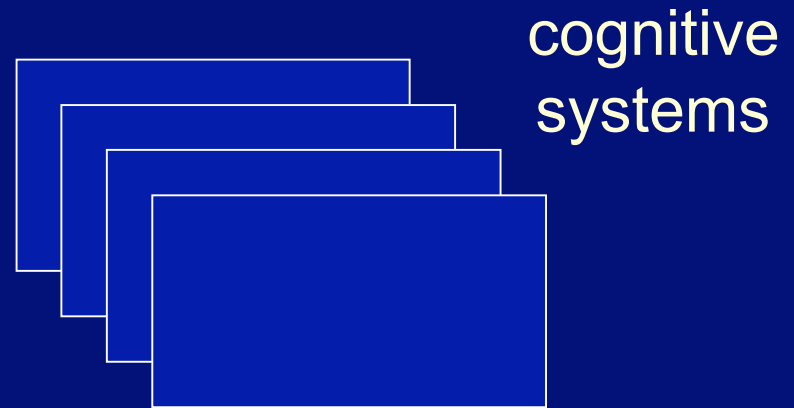
- the good-guy/bad-guy experiment

- patients with lesions in memory areas (LTM)
remember the movie Memento?

- emotional memory / no recognition

- Long-term research goals
 - Objective: to cope with complex and dynamic environments
 - Roles of the emotional system

- relevance
- meta-management
- intuition



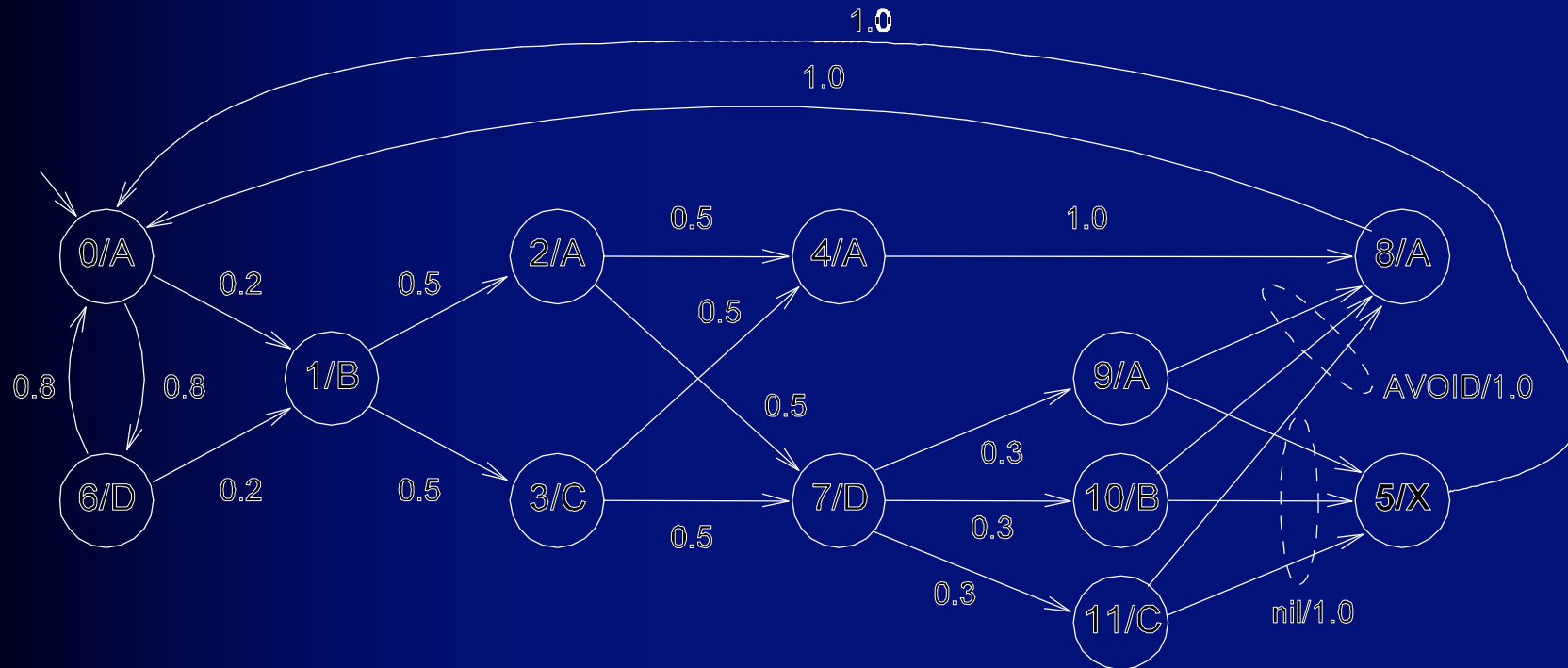
emotional system

- Emotion-based agent model components
 - Two levels of representation:
 - cognitive: rich, complex, slow to process
 - perceptual: rough, simple, fast to process
 - Desirability vector (DV) – components represent various aspects, e.g. positiveness, negativeness, relevance, etc.
 - Homeostatic vector – representation of the body state, drive towards equilibrium, motivation

- Emotion-based agent model mechanisms
 - association between cognitive and perceptual images, and the DV – *somatic marking*
 - when/how to establish these associations
 - when/how to utilize them
 - to use a perceptual (simpler) representation to facilitate the search for matching cognitive representations – *indexing*
 - to confront the two representations when faced with a situation – *an extra dimension*

- Causal models
 - Goal: formulation and refinement of causal models, during interaction of the agent with the environment
 - Bootstrap: built-in association among certain stimuli and certain desirability vectors
 - Testbed: hidden MDP, designed such that there are world laws that allow the (deterministic) anticipation of desirable/undesirable states

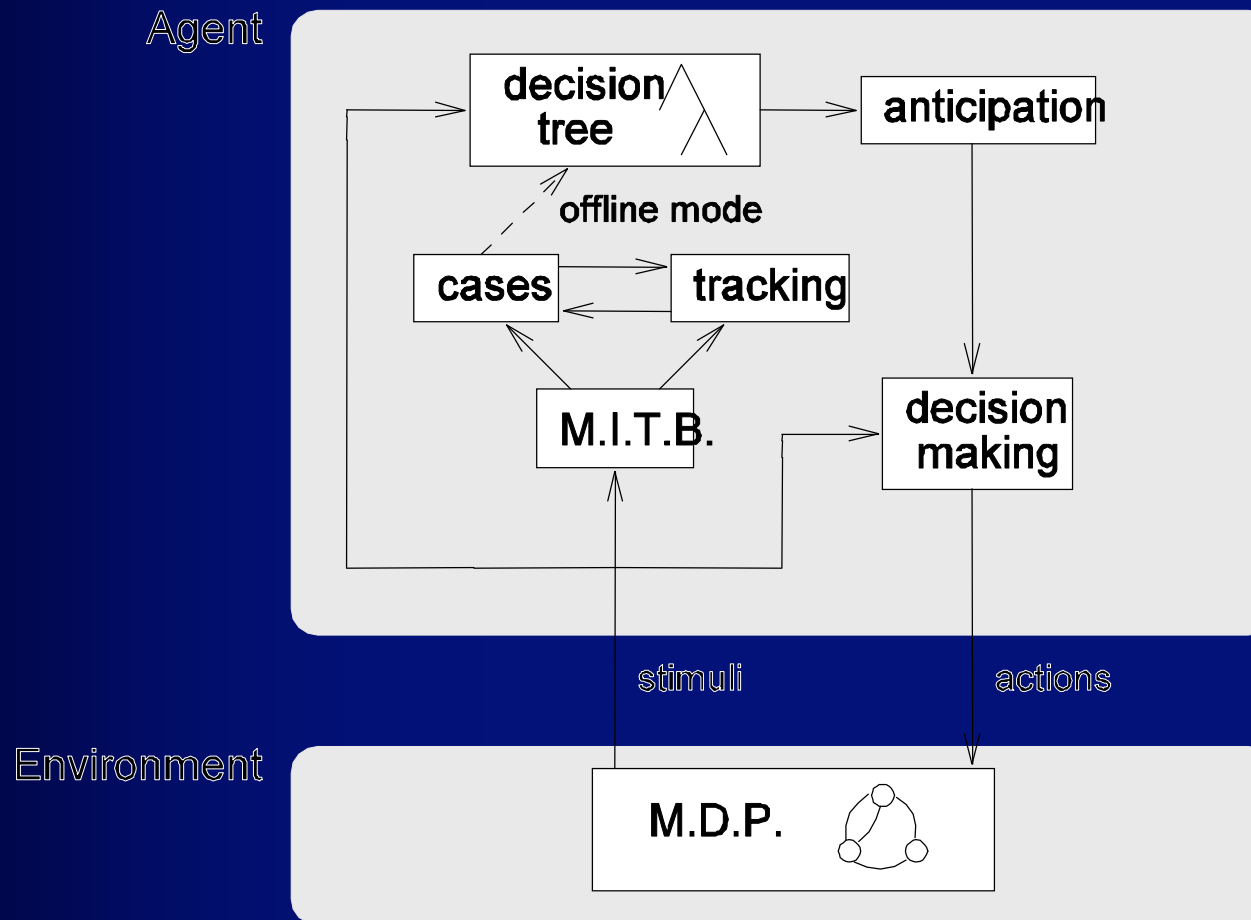
- Example



- bootstrap: symbol 'X' means undesirable
- world law: sequence [B, *, D, *] anticipates the X

- First approach
 - online mode:
 - selectively collect sub-sequences
 - use the causal model (if any) to anticipate and act
 - offline mode:
 - construct / refine the causal model
 - causal model implemented with a decision-tree (C4.5 to build it; *ad-hoc* algorithm to refine it)

- Implementation architecture



– it works, but hard to scale in complexity

- Second approach

- Ideas:

- to use cognitive representation to hold *causality*
 - $\langle \text{cause, (in)action} \rangle \rightarrow \text{effect}$
 - to use perceptual representation to hold *evaluation*
 - in particular, an effect from a ic can only be evaluated using the perceptual memory
 - ic is an under-generalization
 - ip is an over-generalization
 - use online mode to generate hypothesis, and collect statistics
 - use offline mode to generalize ic's, and to get rid of useless information – ip's, indexes, etc.

- Second approach

- cognitive image (ic):

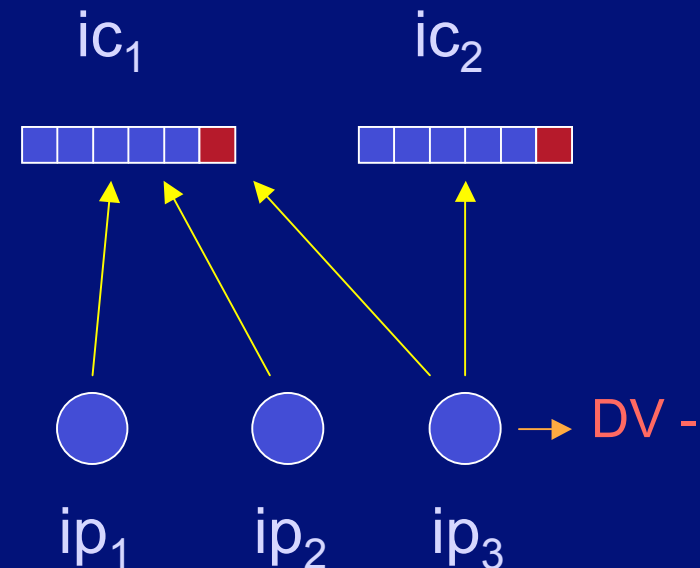
- sub-sequences templates – cause and effect

- perceptual image (ip):

- set of features
 - indexes a set of ic's
 - association with DV's
 - built-in associations:

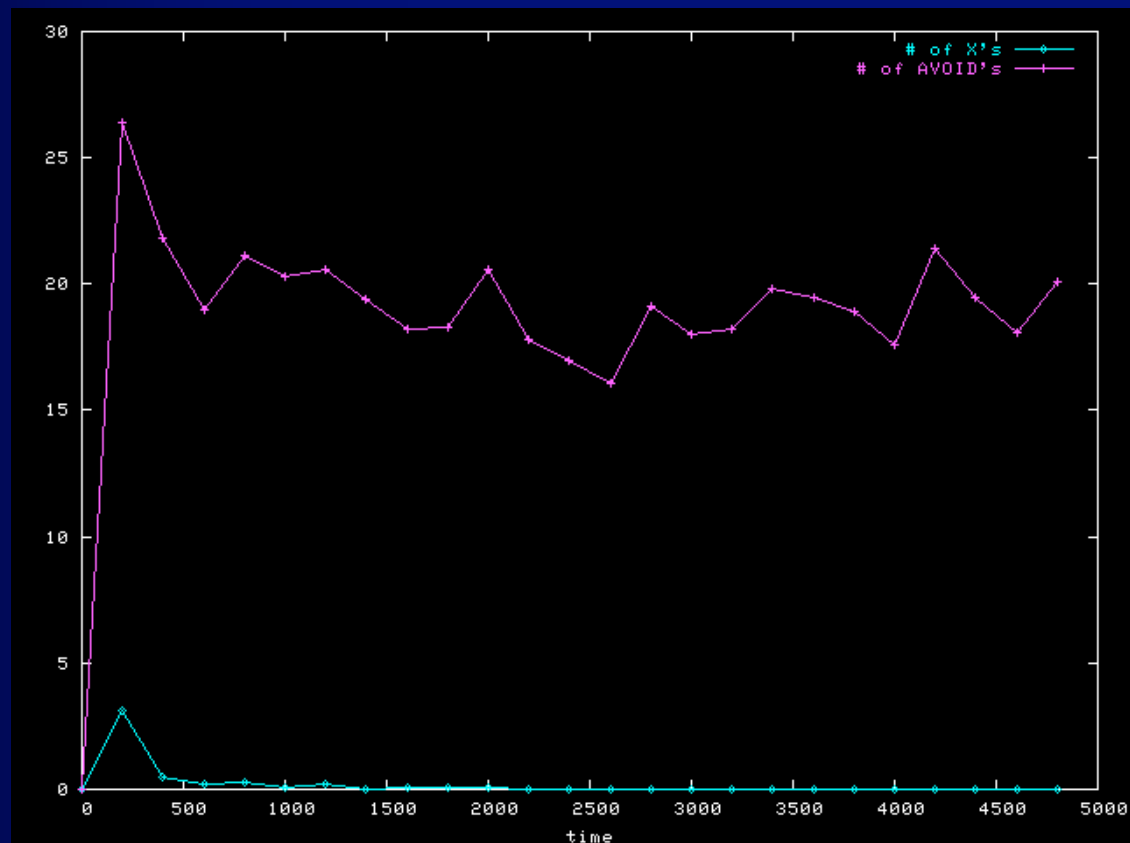
- 'X' → DV-

- 'Y' → DV+



- Second approach
 - Online algorithm:
 1. evaluate stimulus (perceptual memory)
 2. anticipate future outcomes (cognitive memory) and evaluate them (perceptual)
 3. decide according to anticipations
 4. update past anticipations
 - Offline algorithm:
 - generalize ic's
 - eliminate useless ip \rightarrow ic associations
 - eliminate useless ip's

- Second approach
 - Results (5000 step trial):
 - free-run: about 329 'X's
 - agent: about 4 'X's, about 348 actions



- Second approach
 - Results:
 - in simple environments, it works
 - ...still hard to scale to complex environments
 - What do we gain from using the double-representation framework?
 - efficiency – *indexing*
 - relevancy – *ip features*
 - confrontation of two representations with different degrees of specialization
 - intuition and meta-management – *to be explored*

- Current and future work
 - to implement a mechanism of anxiety (anticipatory emotions)
 - meta-management of cognitive processes driven by emotions: e.g. anxiety
 - to shift towards more pro-activity (to play with the environment)
 - chaining of (cause, effect) pairs – *planning*