

Multiagent Systems

3. Practical Reasoning Agents

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Practical Reasoning I

Practical Reasoning is reasoning directed towards **actions**,
i.e. deciding what to do.

Principles of practical reasoning applied to agents largely derive
from work of philosopher **Michael Bratman** (1990):

“Practical reasoning is a matter of weighing conflicting
considerations for and against competing options, where the
relevant considerations are provided by what the agent
desires/values/cares about and what the agent believes.”

(after Wooldridge, p. 65)

Fundamentally different from **theoretical reasoning**, which is
concerned with **belief**, e.g. reasoning about a mathematical
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Practical Reasoning II

Most important \Rightarrow agent has to stop reasoning and **take action** in a timely fashion.

Practical reasoning is foundation for

Belief-Desire-Intention

model of agency.

It consists of two main activities:

- ① Deliberation: deciding **what** to do
- ② Means-ends reasoning: deciding **how** to do it

Combining them appropriately
 \Rightarrow foundation of deliberative agency

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Deliberation & Means-ends reasoning

Deliberation:

- is concerned with determining what one wants to achieve (considering preferences, choosing goals, etc.)
- generates **intentions** (interface between deliberation and means-ends reasoning)

Means-ends reasoning:

- is used to determine how the goals are to be achieved by thinking about **suitable actions**, resources and how to “organize” activity
- generates **plans** which are turned into actions

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Demarcation of the term “intentions”:

- In ordinary speech, intentions refer to actions or to states of mind; here we consider the latter.
- Our focus: **future-directed intentions** also called **pro-attitudes** that tend to lead to actions.
- We make **reasonable attempts** to fulfill intentions once we form them, but they may change if circumstances do.

Main properties of intentions:

- **Intentions drive means-ends reasoning:** If I adopt an intention I will attempt to achieve it, this affects action choice
- **Intentions persist:** Once adopted they will not be dropped until achieved, deemed unachievable, or reconsidered
- **Intentions constrain future deliberation:** Options inconsistent with intentions will not be entertained
- **Intentions influence beliefs concerning future practical reasoning:** Rationality requires that I believe I can achieve intention

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Intentions: Bratman's model

Bratman's model suggests the following properties:

- ➊ Intentions pose problems for agents, who need to determine ways of achieving them
- ➋ Intentions provide a 'filter' for adopting other intentions, which must not conflict
- ➌ Agents track the success of their intentions, and are inclined to try again if their attempts fail
- ➍ Agents believe their intentions are possible
- ➎ Agents do not believe they will not bring about their intentions
- ➏ Under certain circumstances, agents believe they will bring about their intentions
- ➐ Agents need not intend all the expected side effects of their intentions

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Desires:

- describe the states of affairs that are considered for achievement, i.e. basic preferences of the agent.
- are much weaker than intentions, they are not directly related to activity:

“My desire to play basketball this afternoon is merely a potential influence of my conduct this afternoon. It must vie with my other relevant desires [...] before it is settled what I will do. In contrast, once I intend to play basketball this afternoon, the matter is settled: I normally need not continue to weigh the pros and cons. When the afternoon arrives, I will normally just proceed to execute my intentions.” (Bratman, 1990, after Wooldridge, p. 67)

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The BDI Architecture

Sub-components of overall BDI control flow:

- Belief revision function
 - Update beliefs with sensory input and previous belief
- Generate options
 - Use beliefs and existing intentions to generate a set of alternatives/options (=desires)
- Filtering function
 - Choose between competing alternatives and commit to their achievement
- Planning function
 - Given current belief and intentions generate plan for action
- Action generation: iteratively execute actions in plan sequence

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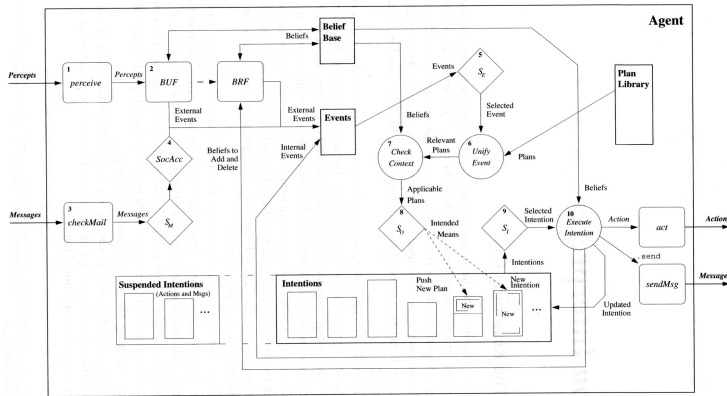
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The Jason reasoning cycle



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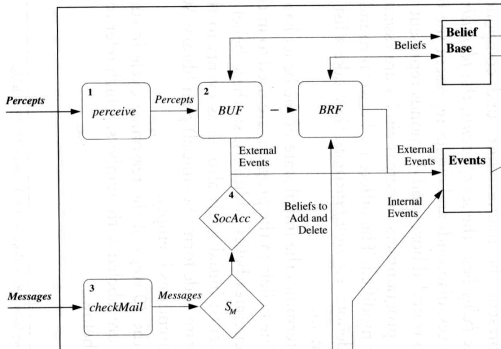
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The Jason reasoning cycle; Bordini et al. (2007), p. 68

- Rounded boxes and diamonds can be customized (Java)
- Circles are essential parts of Jason \Rightarrow not modifiable

(1/2) Perception & Belief update



- Sense environment and update beliefs via Belief Update Function BUF
- **perceive** and **BUF** can be reprogrammed \Rightarrow interface to real world robots

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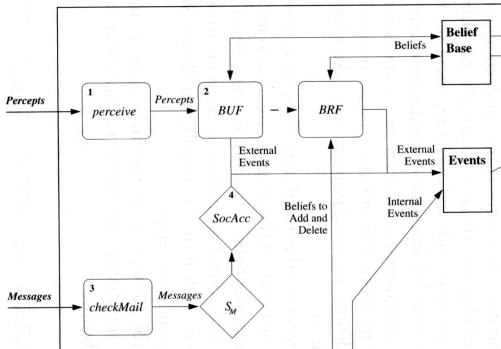
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(3/4) Messages & SocAcc



- Messages received via **checkMail** method
- Selecting 'Socially Acceptable' messages in **SocAcc** method \Rightarrow kind of a low-level "spam filter"

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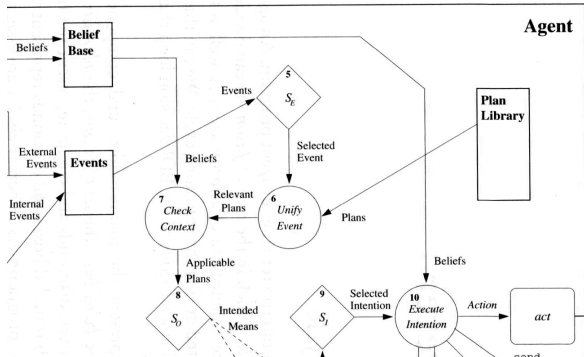
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(5) Selecting an event



- **Events** represent either environment changes or internal changes (related to goals)
- Per reasoning cycle **only one** pending event is processed (FIFO principle in default implementation)
- Customize this to handle priorities

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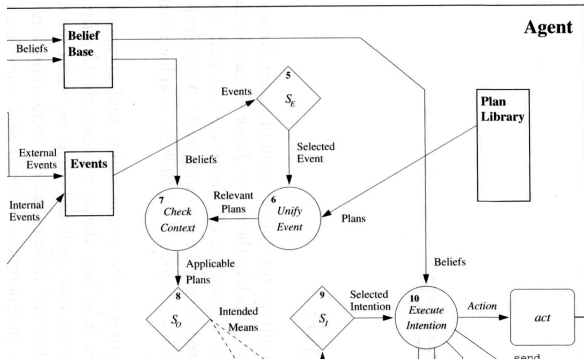
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(6) Retrieving all relevant plans



- Check **Plan Library** component for all relevant plans
- *Triggering event* of plan needs to **unify** with selected event
- Returns **set of relevant plans**

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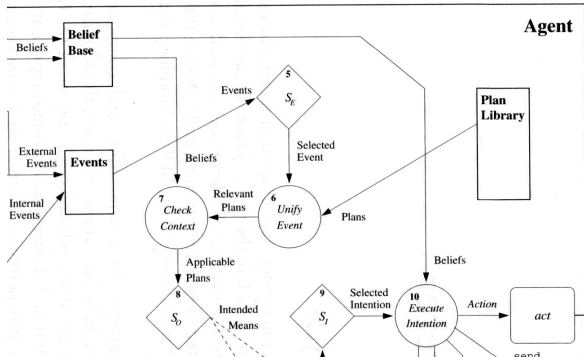
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(7) Check plan contexts



- Select from *relevant plans* those that are **applicable**
- Only true, when a plan's **context** is a *logical consequence* of the agent's **Belief Base**
- Returns **set of applicable plans**

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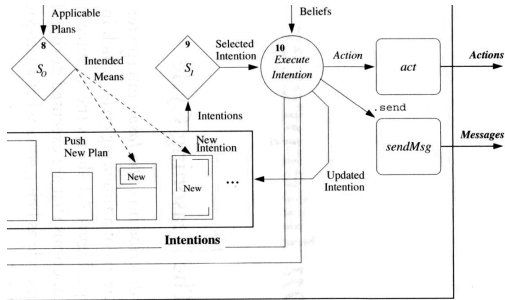
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(8) Selecting one applicable plan



- Committing to a plan \Rightarrow forming an **intention**
- *Applicable plan selection function* S_O can be customized
- Default function S_O uses **first-come-first-selected** heuristics \Rightarrow depends on **order of plan definitions!!!**

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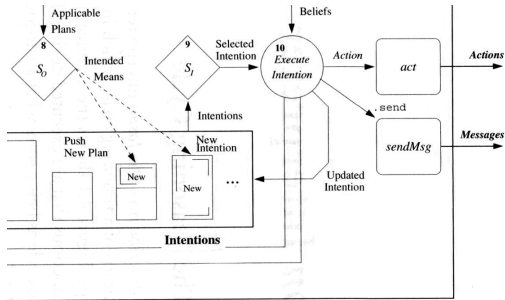
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(9) Selecting an intention



- Default *intention selection function* $S_I \Rightarrow$ **round-robin**
- Only **one action** of each intention is executed
- Select top-most intention, execute its first step, push it back to end of list (can be customized, of course)
- \Rightarrow **dividing attention equally** over *all* intentions

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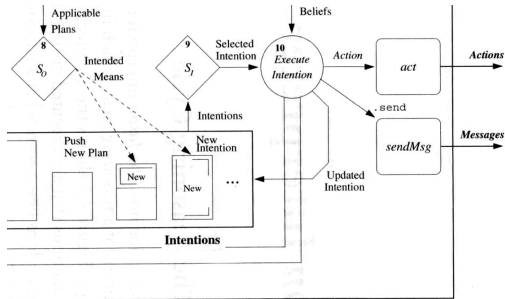
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(10) Executing one step of an intention



- **Intention** is a **stack of partially instantiated plans**, e.g.:
`[+!g : true <- a2. | +b : true <- !g; a1.]`
- **Body of first plan** is considered, here only `a2`
- First **formula** is *dealt with*, here action `a2`, and *deleted*
- **Updated intention** is pushed back to intention stack

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The BDI architecture – formal model

- Let $B \subseteq Bel$, $D \subseteq Des$, $I \subseteq Int$ be sets describing **beliefs**, **desires**, and **intentions** of an agent
- Percepts Per and actions Ac as before
- $Plan$ set of all plans (for now: sequences of actions)

Model described through a set of abstract functions:

- Belief revision $brf : \mathcal{P}(Bel) \times Per \rightarrow \mathcal{P}(Bel)$
- Option generation $options : \mathcal{P}(Bel) \times \mathcal{P}(Int) \rightarrow \mathcal{P}(Des)$
- Filter to select options
 $filter : \mathcal{P}(Bel) \times \mathcal{P}(Des) \times \mathcal{P}(Int) \rightarrow \mathcal{P}(Int)$
- Means-ends reasoning
 $plan : \mathcal{P}(Bel) \times \mathcal{P}(Int) \times \mathcal{P}(Ac) \rightarrow Plan$

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Means-ends reasoning

What does the *plan* function actually do?

⇒ *how* to **achieve goals** (ends) using available **means**

Classical **AI planning** uses the following representations as inputs:

- A **goal** (intention, task) to be achieved (or maintained)
- Current **state** of the environment (beliefs)
- **Actions** available to the agent

Output is a **plan**, i.e. a “recipe for action” to achieve a goal from current state.

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STRIPS: classical planning system

STRIPS most famous classical planning system:

- State and goal are described as logical formulæ
- Action schemata describe preconditions & effects of actions

Most famous application scenario \Rightarrow Blocks world:

- ➊ Given: A set of cube-shaped blocks sitting on a table
- ➋ Robot arm can move around/stack blocks (one at a time)
- ➌ Goal: configuration of stacks of blocks

Formalization in STRIPS:

- State description through set of literals, e.g.
 $\{\text{Clear}(A), \text{On}(A, B), \text{OnTable}(B), \text{OnTable}(C), \text{Clear}(C)\}$
- Same for goal description, e.g.
 $\{\text{OnTable}(A), \text{OnTable}(B), \text{OnTable}(C)\}$
- Action schemata: precondition/add/delete list notation

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Blocks world example

Some action schemata examples:

```
Stack(x, y)
pre{Clear(y), Holding(x)}
del{Clear(y), Holding(x)}
add{ArmEmpty, On(x, y)}
```

```
UnStack(x, y)
pre{On(x, y), Clear(x), ArmEmpty}
del{On(x, y), ArmEmpty}
add{Holding(x), Clear(y)}
```

```
Pickup(x)
pre{Clear(x), OnTable(x), ArmEmpty}
del{OnTable(x), ArmEmpty}
add{Holding(x)}
```

```
PutDown(x) ???
```

(Linear) plan = sequence of action schema instances

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Formal model of planning

Define a **descriptor** for an action $\alpha \in Ac$ as

$$\langle P_\alpha, D_\alpha, A_\alpha \rangle$$

\Rightarrow sets of **first-order logic formulæ** of precondition, delete-, and add-list

(Although these may contain variables and logical connectives we ignore these for now and assume only ground atoms)

A **planning problem** $\langle \Delta, O, \gamma \rangle$ over Ac specifies:

- Δ as the (belief about) initial state (a list of atoms)
- a set of operator descriptors $O = \{\langle P_\alpha, D_\alpha, A_\alpha \rangle | \alpha \in Ac\}$
- an intention γ (set of literals) to be achieved

A **plan** is a sequence of actions $\pi = (\alpha_1, \dots, \alpha_n)$ with $\alpha_i \in Ac$

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Acceptable and correct

In a planning problem $\langle \Delta, O, \gamma \rangle$ a plan π determines a sequence of environment models $\Delta_0, \dots, \Delta_n$.

For these we have:

- $\Delta_0 = \Delta$
- $\Delta_i = (\Delta_{i-1} \setminus D_{\alpha_i}) \cup A_{\alpha_i}$ for $1 \leq i \leq n$

Then:

- π is **acceptable** wrt $\langle \Delta, O, \gamma \rangle$ iff $\Delta_{i-1} \models P_{\alpha_i}$ for all $1 \leq i \leq n$
- π is **correct** wrt $\langle \Delta, O, \gamma \rangle$ iff π is acceptable and $\Delta_n \models \gamma$

The problem of AI planning:

Find a correct plan π for planning problem $\langle \Delta, O, \gamma \rangle$ if one exists, else announce that none exists.

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Practical planning

Below, we will use:

- $head(\pi)$, $tail(\pi)$, $pre(\pi)$, $body(\pi)$ for parts of a plan
- $execute(\pi)$ to denote execution of a whole plan
- $sound(\pi, I, B)$ to denote that π is correct given intentions I and beliefs B

Note:

- Planning does not need to involve plan generation
- Plan libraries can be used (as in Jason)

⇒ Let's integrate **means-ends reasoning** into BDI implementation

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BDI control loop (version 1)

Practical Reasoning Agent Control Loop v1:

```
1  $B \leftarrow B_0; I \leftarrow I_0;$ 
2 while true do
3    $\rho \leftarrow \text{see}();$ 
4    $B \leftarrow \text{brf}(B, \rho); D \leftarrow \text{options}(B, I); I \leftarrow \text{filter}(B, D, I);$ 
5    $\pi \leftarrow \text{plan}(B, I, Ac);$ 
6   while  $\neg(\text{empty}(\pi) \vee \text{succeeded}(I, B) \vee \text{impossible}(I, B))$  do
7      $\alpha \leftarrow \text{head}(\pi); \text{execute}(\alpha);$ 
8      $\pi \leftarrow \text{tail}(\pi);$ 
9   end
10 end
```

What could be the problem with this control loop?

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Commitment

Are deliberation and planning sufficient to achieve desired behaviour? \Rightarrow Unfortunately not.

After **filter** function, agent makes a **commitment** to chosen option (this implies temporal persistence)

\Rightarrow How long should an intention persist? (remember dung beetle?)

Three different commitment strategies:

- **Blind/fanatical** commitment: maintain intention until it has been achieved
- **Single-minded** commitment: maintain intention until achieved or impossible
- **Open-minded** commitment: maintain intention as long as it is believed possible

Important: agents commit themselves both to ends (intention) and means (plan)

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Commitment to ends and means

With regard to **commitment to means**, the previous control loop implemented single-minded commitment (using predicates *succeeded*(I, B) and *impossible*(I, B)).

Commitment to ends \Rightarrow **intention reconsideration** (IR):

- When would we stop to think whether intentions are already fulfilled/impossible to achieve?
- Trade-off: intention reconsideration is costly but necessary \Rightarrow meta-level control (*reconsider*(I, B) predicate)
- IR strategy is optimal if it would have changed intentions had he deliberated again (assuming IR itself is cheap)

Rule of thumb: being “bold” is fine as long as world doesn’t change at a high rate

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BDI control loop (version 2)

Practical Reasoning Agent Control Loop v2:

```
1   $B \leftarrow B_0; I \leftarrow I_0;$ 
2  while true do
3       $\rho \leftarrow \text{see}();$ 
4       $B \leftarrow \text{brf}(B, \rho); D \leftarrow \text{options}(B, I); I \leftarrow \text{filter}(B, D, I);$ 
5       $\pi \leftarrow \text{plan}(B, I, Ac);$ 
6      while  $\neg(\text{empty}(\pi) \vee \text{succeeded}(I, B) \vee \text{impossible}(I, B))$  do
7           $\alpha \leftarrow \text{head}(\pi); \text{execute}(\alpha);$ 
8           $\pi \leftarrow \text{tail}(\pi);$ 
9           $\rho \leftarrow \text{see}(); B \leftarrow \text{brf}(B, \rho);$ 
10         if reconsider( $I, B$ ) then
11              $D \leftarrow \text{options}(B, I); I \leftarrow \text{filter}(B, D, I);$ 
12         end
13         if  $\neg(\text{sound}(\pi, I, B))$  then
14              $\pi \leftarrow \text{plan}(B, I, Ac);$ 
15         end
16     end
17 end
```

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- Discussed practical reasoning systems
- Prevailing paradigm in deliberative agent design
- Deliberation defined as interaction between beliefs, desires, and intentions
- Jason reasoning cycle explained
- Means-ends reasoning and planning
- Commitment strategies and intention reconsideration

⇒ Next time: **Reactive and Hybrid Agent Architectures**

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Acknowledgments

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- Dr. Michael Rovatsos, The University of Edinburgh
<http://www.inf.ed.ac.uk/teaching/courses/abs/abs-timetable.html>
- Michael Wooldridge: **An Introduction to MultiAgent Systems**, John Wiley & Sons, 2nd edition 2009.
- Rafael H. Bordini, Jomi Fred Hübner, Michael Wooldridge: **Programming Multi-Agent Systems in AgentSpeak using Jason**, Wiley, 2007.

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