

INVESTICE DO ROZVOJE VZDĚLÁVÁNÍ

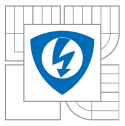
Introduction to Programming Autonomous Agents and Multi-agent Systems (short tutorial)

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Czech Technical University in Prague

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Tato prezentace je spolufinancována Evropským sociálním fondem a státním rozpočtem České republiky.



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How to program intelligent agents?

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Motivation & Scope

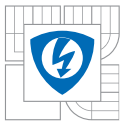
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Cognitive agents
Example: Airport
E-Assistant (Ape)

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Definition 1 (intelligent agents). are artificial entities assumed to be *autonomous, proactive, reactive, as well as socially able*.

- **autonomy:** the agent acts without its user's intervention, *agent is not an object* (in OOP sense)
- **proactiveness:** the agent acts *purposefully*, i.e., towards reaching goals
- **reactivity:** the agent is responsive to changes of the environment
- **social ability:** it is capable to communicate, coordinate and cooperate with its users and peers





Intelligent agents

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Definition 2 (intelligent agents). are artificial entities assumed to be *autonomous, proactive, reactive, as well as socially able*.

- **autonomy:** the agent acts without its user's intervention, *agent is not an object* (in OOP sense)
- **proactiveness:** the agent acts *purposefully*, i.e., towards reaching goals
- **reactivity:** the agent is responsive to changes of the environment
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communication \rightsquigarrow **symbolic information processing!**





Cognitive agents

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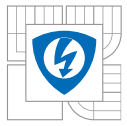
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Definition 3 (cognitive/knowledge intensive agent). employ cognitive processes, such as knowledge representation and reasoning as the basis for decision making and action selection. I.e., they construct and maintaining a *mental state*.

Definition 4 (mental state). agent's representation of the environment, itself, its peers, etc.



Example: Airport E-Assistant (Ape)

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**Example: Airport
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Example: Airport E-Assistant (Ape)

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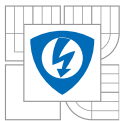
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The robot guides and advices passengers at the airport.

- navigates through crowds, maintains energy level
- solves and responds to requests along the way
- communicates with the airport infrastructure, etc...



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Agent program:
action selection (+
state change)

Hybrid architectures
Hybrid architectures
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Agent program: action selection (+ state change)

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Agent program: action selection (+ state change)

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$$next_action = \mathcal{P}(perceptions \oplus \sigma)$$

$$(\sigma' = \sigma \otimes perceptions)$$

reactive systems: $\sigma \rightarrow \emptyset$

- no/little past, difficult to implement *proactiveness*
- + responsive, robust w.r.t. unexpected = *graceful degradation*

deliberative systems: $perceptions \rightarrow \emptyset$

- weak responsiveness to the environment
- + keeps context (future) = *proactiveness*, planning





Hybrid architectures

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environment dynamics, graceful degradation \rightsquigarrow **reactivity**

goals, social abilities \rightsquigarrow **deliberation/planning**

How to marry reactivity & deliberative features?



Hybrid architectures

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environment dynamics, graceful degradation \rightsquigarrow **reactivity**

goals, social abilities \rightsquigarrow **deliberation/planning**

How to marry reactivity & deliberative features?

Hybrid architectures!

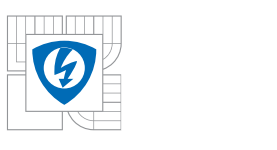
procedure AGENT–CYCLE

SENSE



← PLAN

ACT



Hybrid architectures & agent-oriented programming languages

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Agent program: action selection (+ state change)

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Architectures:

1987: PRS

1988: IRMA

1991: Abstract BDI architecture

1994: INTERRAP

– *incomplete* –

(Georgeff and Lansky)

(Bratman, Israel and Pollack)

(Rao and Georgeff)

(Müller and Pischel)

Languages:

1990: AGENT-0

1996: AgentSpeak(L)

1996: Golog

1997: 3APL

1998: ConGolog

2000: JACK

2000: GOAL

2002: Jason

2003: Jadex

2008: Behavioural State Machines/Jazzyk

2008: 2APL

– *incomplete* –

(Shoham)

(Rao)

(Reiter, Levesque, Lesperance)

(Hindriks et al.)

(Giacomo, Levesque, Lesperance)

(Busetta et al.)

(Hindriks et al.)

(Bordini, Hubner)

(Braubach, Pokahr et al.)

(Novák)

(Dastani)





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Belief-Desire-
Intention
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of the discourse
I-System (cont.)
Commitment
strategies
Operationalizing the
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Beliefs and goals

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- **(B)eliefs:** reflect agent's *static* beliefs about its environment, itself, its peers, etc. (*now*)
- **(D)esires:** descriptions of situations the agent wants to bring about (*future*)

Dynamics:

- **automated planning:** provides the connection from *now* to the *future*

Agent's *intentions* are considered to be reducible to (B) and (D).

Cohen & Levesque: *Intention is a choice with commitment*. 1990





Belief-Desire-Intention architecture

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- **(B)eliefs:** reflect agent's *static* beliefs about its environment, itself, its peers, etc. (*now*)
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- **(I)ntentions:** *partial plans of action that the agent is committed to execute in order to fulfill the goals*





Belief-Desire-Intention architecture

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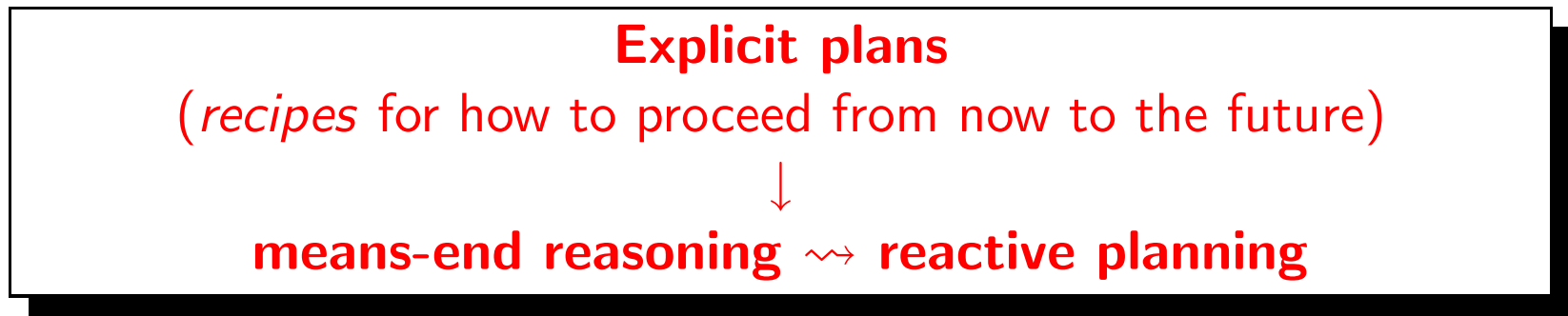
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- **(I)ntentions:** *partial plans of action that the agent is committed to execute in order to fulfill the goals*



- planning is not a must!
- partial plans can be encoded in the design time

Bratman: *Intentions, Plans, and Practical Reason*. 1987

Rao & Georgeff: *Modeling Rational Agents within a BDI-Architecture*. 1991





CTL*: the language of the discourse

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(generalized) computation tree logic:

- branching time
- temporal modalities
- free mixing of temporal operators and quantifiers

$$\theta ::= p \mid \neg\theta \mid \theta \wedge \theta$$

$$\varphi ::= \theta \mid \neg\varphi \mid \varphi \wedge \varphi \mid \bigcirc\varphi \mid \diamond\varphi \mid \square\varphi \mid \varphi \mathcal{U} \varphi \mid \forall\varphi \mid \exists\varphi$$





CTL*: the language of the discourse

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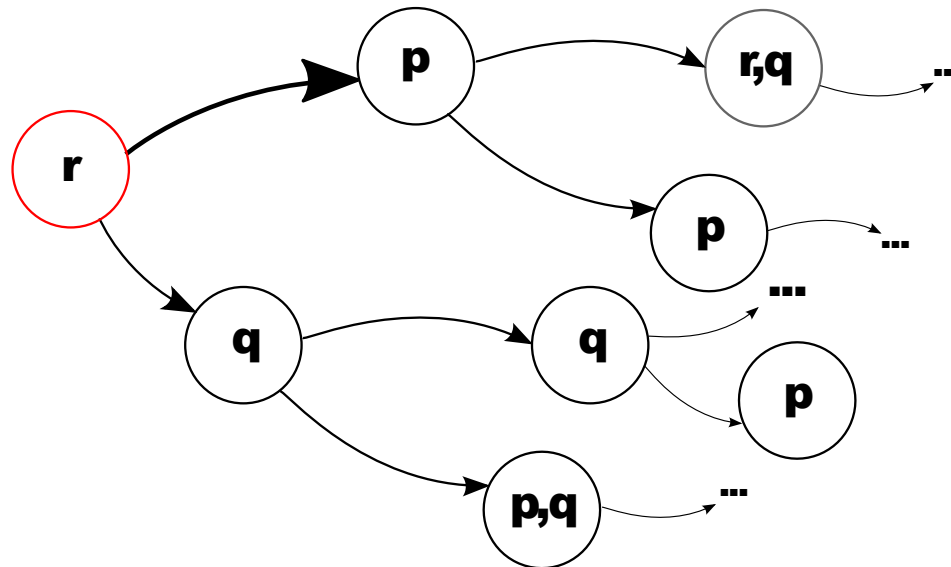
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(generalized) computation tree logic:

- branching time
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$$\theta ::= p \mid \neg\theta \mid \theta \wedge \theta$$

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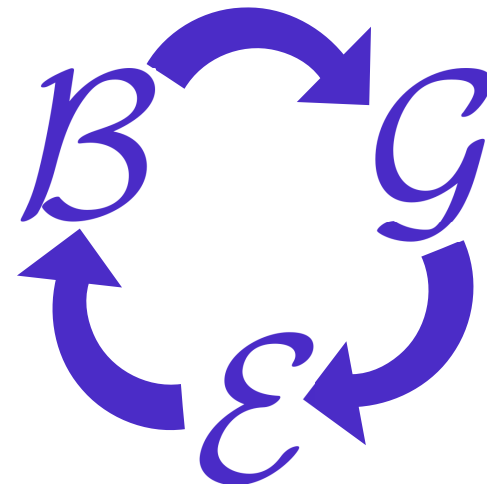
r
 $\exists \bigcirc p$
 $\forall \diamond p$
 $\exists \square p$
 $\neg \bigcirc \exists \square p$
 $\neg \bigcirc \forall \diamond r$



I-System (cont.)

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- AI1:** $GOAL(\alpha) \Rightarrow BEL(\alpha)$ (B-G compatibility)
- AI2:** $INTEND(\alpha) \Rightarrow GOAL(\alpha)$ (G-I compatibility)
- AI3:** $INTEND(does(\alpha)) \Rightarrow does(\alpha)$ (intentions lead to actions)
- AI4:** $INTEND(\phi) \Rightarrow BEL(INTEND(\phi))$ (believing in intentions)
- AI5:** $GOAL(\phi) \Rightarrow BEL(GOAL(\phi))$ (believing in goals)
- AI6:** $INTEND(\phi) \Rightarrow GOAL(INTEND(\phi))$ (desiring intentions)
- AI7:** $done(e) \Rightarrow BEL(done(e))$ (awareness of actions)
- AI8:** $INTEND(\phi) \Rightarrow \forall \diamond (\neg INTEND(\phi))$ (no infinite deferral)





Commitment strategies

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blind commitment: the agent maintains intentions until it actually believes that they are achieved

$$\text{INTEND}(\forall \diamond \phi) \Rightarrow \forall (\text{INTEND}(\forall \diamond \phi) \mathcal{U} \text{BEL}(\phi))$$

~> I want ϕ ! (no care possibility to reach ϕ)

single-minded commitment: the agent maintains intentions as long as as it believes they are still achievable

$$\text{INTEND}(\forall \diamond \phi) \Rightarrow \forall (\text{INTEND}(\forall \diamond \phi) \mathcal{U} (\text{BEL}(\phi) \vee \neg \text{BEL}(\exists \diamond \phi)))$$

~> I want ϕ if it is possible! (regardless of its desires/needs)

open-minded commitment: the agent maintains intentions as long as they are still its goals

$$\text{INTEND}(\forall \diamond \phi) \Rightarrow \forall (\text{INTEND}(\forall \diamond \phi) \mathcal{U} (\text{BEL}(\phi) \vee \neg \text{GOAL}(\exists \diamond \phi)))$$

~> I want ϕ if it makes sense at all.





Operationalizing the BDI architecture

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structural decomposition (knowledge bases):

belief base

- ◆ KRR technology \rightsquigarrow First-Order Logic

goal base

- ◆ mutual compatibility of goals?
- ◆ declarative, procedural, maintenance
- ◆ KRR technology \rightsquigarrow set of ground FOL terms

intentions

1. *plan library*: storage of partial plan prescriptions
2. *intention stack*: partial plan instances

agent system dynamics:

1. library plan instantiation
2. gradual plan decomposition & execution





Abstract BDI reasoning cycle

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initialize–state

loop

options := generate–options(event–queue)

selected–options := deliberate(options)

update–intentions(selected–options)

execute()

get–new–external–event()

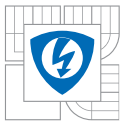
drop–successful–attitudes()

drop–impossible–attitudes()

end loop

Rao & Georgeff. BDI Agents: From Theory to Practice, 1995





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AgentSpeak(L)/Jason

Reasoning cycle

Jason (example)

Jadex

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What is an APL?

- operationalization of a BDI architecture
- provides an underlying architecture & *tools for encoding the system dynamics*
- syntax & model of execution (semantics)

Why APLs?

- ↔ software engineering ↔ systems modeling
- ↔ clear properties (expressivity, verification, etc.)





The landscape

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BDI programming systems

Theoretically oriented

- declarative languages built from scratch \rightsquigarrow new syntax
- + clear theoretical properties \rightsquigarrow verification
- + declarative KR techniques
- no integration with external/legacy systems

AgentSpeak(L), 3APL,
2APL, GOAL, CAN, etc.

Engineering approaches

- + layer of specialised language constructs over a robust mainstream programming language (Java) \rightsquigarrow code re-usability
- host language semantics
- KR in an imperative language
- + easy integration with external systems and environments

JACK, Jadex





AgentSpeak(L)/Jason

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- programming language for BDI agents
 - notation based on logic programming
 - AgentSpeak(L) \rightsquigarrow an abstract programming language
 - Jason \rightsquigarrow operational semantics for AgentSpeak
 - various pragmatic extensions like external actions (Java)
 - (platform for developing multi-agent systems)
-

- beliefs are FOL terms
- agent program \rightsquigarrow set of rules
triggering_event : context \leftarrow body.
- **events**: +b, -b, +!g, -!g, +?g, -?g \rightsquigarrow implicit goals!
- **context**: logical formula (\wedge, \vee, \neg)
- **body**: sequence of actions and subgoals to achieve

developed by Jomi F. Hübner and Rafael H. Bordini





Reasoning cycle

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1. Perceiving the Environment
2. Updating the Belief Base
3. Receiving Communication from Other Agents
4. Selecting 'Socially Acceptable' Messages
5. Selecting an Event
6. Retrieving all Relevant Plans
7. Determining the Applicable Plans
8. Selecting one Applicable Plan
9. Selecting an Intention for Further Execution
10. Executing one step of an Intention



Jason (example)

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```

+green_patch(Rock)
  : not battery_charge(low)
  ← ?location(Rock,Coordinates);
    !at(Coordinates);
    !examine(Rock).

+!at(Coords)
  : not at(Coords) & safe_path(Coords)
  ← move_towards(Coords); !at(Coords).

+!at(Coords) ...

```



Jadex

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- programming language for BDI agents
- Java + XML notation \rightsquigarrow towards Agent-Oriented Software Engineering (AOSE)
- mixes object-orientation and BDI concepts
- explicit goals \rightsquigarrow reasoning about (manipulation of) goals
- independent on middleware (adapters for integration with JADE and DIET)

-
- **beliefs:** Java objects (sets)
 - **goals:** explicit (XML) \rightsquigarrow perform, achieve, query maintain
 - **events** \rightsquigarrow the central element
 - **plans:** represent procedural knowledge \rightsquigarrow head, context (both XML), body (Java)
 - capabilities - modularity





Reasoning cycle

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(central point = event list)

1. Communication

(a) select message \rightsquigarrow update the event list

2. Dispatcher

(b) select event (possibly an incoming message)

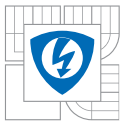
(c) find applicable candidate plans/capabilities

3. Scheduler

(d) select intention

(e) execute one intention step \rightsquigarrow event list update!





Jadex (example)

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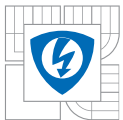
Reasoning cycle

Jadex (example)

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```
<agent name="SampleAgent" package="jadex.examples.SampleAgent" ... >
<!-- ... imports ... -->
<beliefs>
  <belief name="rockExperiment" class="Experiment">
    <fact>new Experiment("rock")</fact>
  </belief>
</beliefs>
<goals>
  <achievegoal name="examineRock">
    <parameter name="position" class="GPS"/>
    <targetcondition>$beliefbase.rockExperiment.isFinished()</targetcond
  </achievegoal>
</goals>
<plans>
  <plan name="moveToTheRock">
    <trigger><goal ref="examineRock"/></trigger>
    <body>new MotionPlan($event.goal.position)</body>
  </plan>
</plans>
</agent>
```

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State of the art & on-going research

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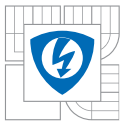
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State of the art & on-going research

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- active developments in the APL arena
 - ↪ 2APL, GOAL, Jadex, JACK, Jazzyk, ...
- **goals** ↪ semantics & dynamics (Dastani, van Riemsdijk, Sardina)
- **planning** ↪ integration/relationships
 - ◆ lookahead (Hindriks, Padgham)
 - ◆ AgentSpeak + planning (Menneguzi)
 - ◆ relationship to HTN (de Silva, Padgham, Sardina)
- **model checking and verification** (Bordini, Fisher)
- **software engineering** (...)
 - ◆ modularity, debugging





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Summary: Agent-oriented programming languages

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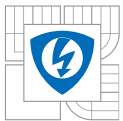
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Summary:
Agent-oriented programming languages

1. intelligent agents \rightsquigarrow *social* abilities \rightsquigarrow **symbolic KRR**
2. computational model: **reactivity vs. deliberation**
3. theoretical foundations = **BDI + KRR + dynamics**
4. I-system = **model of rationality**
5. BDI operationalization & software engineering \rightsquigarrow BDI APL
6. Jason
7. Jadex
8. State of the art + on-going threads



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Thank you for your attention.

