

ECAI 2016 Tutorial Argument and Cognition

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ECAI 2016 (The Hague, Holland)

August 29, 2016

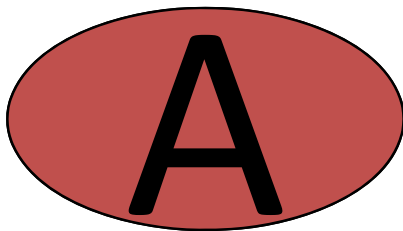
High-Level Tutorial Roadmap

- A. Motivation and Historical Context
- B. Argument and Cognition in Psychology
- C. Computational Argumentation from AI
- D. Argumentation for Decision Making
- E. Argumentation for Comprehension
- F. Acquisition and Learning of Arguments
- G. Thoughts on Computational Cognition
- H. Overall Summary and Conclusions

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A. Motivation and Historical Context

Tutorial Aims and Motivation

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Aims of the Tutorial

- Explore links between Argument & Cognition.
 - **Synergy** between **Cognitive Psychology** and **AI**.
- With emphasis on the **computational** aspects.
 - Can argumentation form a **foundation** for **automating** human cognition / reasoning?

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Motivation / Perspective

- The particular perspective of the tutorial is **Cognitive Computing — Cognitive Systems**
 - **Human-Computer Interaction Symbiosis**
- **Cognitive Systems** with salient characteristics:
 - **Cognitive compatibility** between the systems and the ordinary human users collaborators.
 - Operation and collaboration with humans stem from **computational models** of cognition.

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Example Cognitive Systems

Cognitive Web Search Assistant:

- **Query:** “places to celebrate wedding anniversary”
- **Comprehension** of the input query, using common sense world knowledge (e.g., normally, celebrated romantically and with a dinner), allows the search assistant to transform it to a more focussed query.
- **C-Query:** “romantic restaurants in London”
- What about: “**Simple** places to celebrate ...”?

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Example Cognitive Systems

Cognitive Call Assistant:

- **Generally**, when at work **prefer to allow calls** from family, **but** if in **important meeting prefer to hold calls**.
- **Except** when there is a **family emergency**.
- Call assistant is required to engage in:
 - **High-level** preference elicitation from users.
 - **Cognitive compatibility** with ordinary users.
 - **Comprehension** of common sense **concepts**.

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Cognitive Programming *Challenge*

- Programming for the **masses** through:
 - **Cognitive** elicitation of user **preferences**.
 - **Natural interaction** with the human user.
 - **Acquisition** though machine learning of relevant background **world knowledge**.
 - Process should be **transparent** to the user.
- **Cognitive Decision Making & Comprehension** form the **central metaphor** of **computation**.

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Cognitive Programming *Thesis*

- **Can argumentation provide a foundational notion of computation in the CP framework?**
 - Program execution as a **dialectical** process of **argumentation** — internal or external with user.
- Need to formally explore the links between **argument** and **cognition** to realize the thesis.

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A. Motivation and Historical Context

The AI Historical Perspective

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The Vision of Artificial Intelligence

posits that “intelligence can in principle be so **precisely described** that a machine can be made to **simulate it**” and seeks machines that “**solve kinds of problems** now reserved for humans”.



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Describe / Simulate / Engineer?

- **Describing** Intelligence (*Comp. Cog. Psych.*):
 - What? Understand **cognition** in humans.
 - How? Use available **computational** tools.
- **Simulating** Intelligence (*Traditional/Old AI*):
 - What? Solve *several* **computational** tasks.
 - How? Use **cognitively**-inspired processes.
- **Engineering** Intelligence (*Contemporary AI*):
 - What? Solve a *particular* **cognitive** task.
 - How? Use available **computational** tools.

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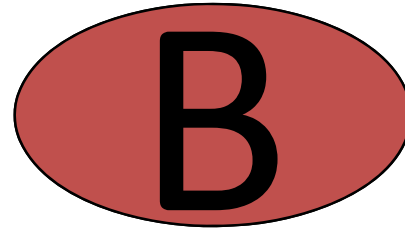
How “Cognitive” is an AI System?

depth of introspection	behavioral level	human-compatible response
1	inferencing	This animal cannot fly.
2	reasoning	Dodos are birds, but flightless.
3	supporting	I have seen dodos, but none flying.
4	explicitating	When I see that a simple rule holds on several occasions without seeing an exception, I start using that rule.
5	additional / super-human levels of introspection?	

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B. Argument and Cognition in Psychology

Dictionary Definitions

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Dictionary Definition of Cognition

- “The **mental action** or process of **acquiring knowledge** and **understanding** through thought, experience, and the senses.”
- “**Conscious mental activities**: thinking, understanding, learning, and remembering.”
- Two aspects of cognition:
 - **acquiring** knowledge from experience / sensing
 - **using** knowledge for inferencing / **reasoning**

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Dictionary Definition of Argument

- **Ontological**: “A **reason** or set of reasons given **in support of** an idea, action or theory.”
 - Emphasizes the process of **construction**.
- **Social**: “An **exchange** of diverging or **opposite views**, typically a heated or angry one.”
 - Emphasizes the process of **evaluation**.
- Two aspects of argument:
 - summed up by “for the sake of argument”
 - thus, as a basis for **discussion or reasoning**

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Argument and Logic for Cognition

- “A logical argument (or argument) is a **process** of creating a new statement from one or more existing statements. An argument **proceeds** from a set of premises to a conclusion, ..., via a procedure called **logical inference**.”
- Refers to **construction** (not **evaluation**).
- **Logical inference** as construction of argument.
 - One type of **strict (non-defeasible)** inference.
 - Vice-versa: Argument as **alternative for** logic?

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B. Argument and Cognition in Psychology

Argumentative Basis for Cognition

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Psychology of Reasoning

- **Humans are “poor” logical reasoners.**
- Empirically, for everyday reasoning involving:
 - “**Uncertain** information”.
 - “**Relevance relations** between pieces of information that are **beyond the remit of CL**”.
- Yet, most **effort** in Psychology of Reasoning focused on the **violation** of logical-norms.
 - Do/can humans distinguish between **logically valid** and **invalid** cases of reasoning?
 - **Reasoning** as synonymous to **logical reasoning**.

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Psychology of Reasoning

Abundance of **evidence against** classical logical reasoning in humans:

- Empirical evidence that humans use Modus Ponens, but not Modus Tollens.
- Attempts to stay close to formal Classical Logic show the need to deviate from it.
- Humans do not reason in “possible models” but in an “intended model”.

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Psychology of Reasoning

Non-classical reasoning forms in **Psychology**:

- **Inductive** Reasoning: Typicality in categories.
- **Preferred Situations**: Restrict to some models.
- **Production Systems**: Rules to typical inferences.

Psychology also influenced the development of **non-monotonic Logics** in **AI** (more on this later!)

- **Defeasible** and **Revisable** forms of reasoning.

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Psychology of Argumentation

Argument is recognized as a **reason** for a claim.

- **Logical Argument**: the reason is a logically valid proof from premises to the claim.
 - Argument as **synonymous** to logical argument.

Recently, there has been a **wider consideration**:

- **Structure** of arguments:
 - Claims and counter-claims.
- **Social** dimension of argumentation:
 - Dialogical context giving rise to arguments.

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Psychology of Argumentation

**“Why do humans reason?
Arguments for an argumentation theory”**

- Construct arguments for accepting or declining a “conclusion that was raised”.
 - argumentation to **support / reach** a position.
 - **awareness** not only of the conclusion, but also of the arguments that support the conclusion.
- **Improve argument** if motivated / challenged.
 - Arguments **evaluated against each other**.

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Psychology of Argumentation

“Why do humans reason? ...”

- **Reasoning depends on degree of conflict.**
- Distinguishes between:
 - Argument **production** (**solidary** reasoning).
 - Argument **evaluation** (reasoning **in discussion**).
- Production is **lazy** and **biased**.
 - Hence **objectively** “poor quality” arguments.
- Argument evaluation can result in objectively **better or revised** arguments/claims.

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Psychology of Argumentation

- In recent experiments, **world knowledge** that **human readers** used to **comprehend** (simple) stories could be migrated into a computational system for Story Comprehension, called STAR.
- STAR (more on this later!) treats knowledge as **arguments** and reasons via **argumentation**.

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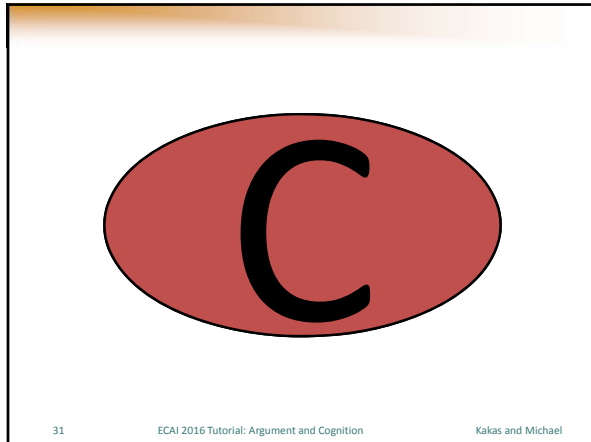
Part B: Summary and Conclusions

- Features of human reasoning **compatible** with argumentation:
 - Handles **conflicts** / no absolute knowledge.
 - **Tentative** conclusions / revises when surprised.
 - Human **biases** influence the reasoning.
 - **Justification** of conclusion / decision matters.
 - Human reasoning is “**on demand**” / **dialectical**.
- Argument is **native** to human reasoning.
 - Argumentation offers **unified** perspective of empirical psychological evidence on nature of human reasoning (**re-enforced** by work in AI).

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C. Computational Argumentation from AI

Defeasibility and Argumentation

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- ## Computational Argumentation
- Early work from Philosophy of **Defeasible Reasoning**:
 - R.P. Loui, "Defeat Among Arguments: A System of Defeasible Inference", 1987.
 - J.L. Pollock, "Defeasible Reasoning", 1987.
 - Linking **defeasibility** to non-monotonic reasoning in Artificial Intelligence:
 - J. McCarthy, "Programs with Common Sense", 1958.
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- ## Computational Argumentation
- A plethora of **non-monotonic logics** aim to address the process of Inference/Reasoning as exhibited in Human Cognition.
 - **from**: J. McCarthy's "Programs with Common Sense" and Circumscription
 - **to**: Default Logic, Autoepistemic Logics, ..., Negation as Failure in Logic Programming, ...
 - By the end of 1990s all approaches had been **reformulated** in terms of Argumentation.
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- ## Computational Argumentation
- Re-formulation in **Abstract Argumentation** (P.M. Dung and others: R. Kowalski, ...).
 - Abstracting from the case of **NAF in LP** in terms of argumentation:
 - Re-formulation of the "relative consistency" semantics of NAF in terms of argumentation.
 - Re-formulation of semantics of LP in terms of argumentative (coherent) labelled world views.
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C. Computational Argumentation from AI

Abstract Argumentation

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Abstract Argumentation in AI

- **Abstract Argumentation** framework $\langle Arg, Att \rangle$
 - Arg is a set of **individual** arguments
 - Att is a binary relation (**attack**) on Arg
 - Expresses the notion of **counter-arguments**.
- Build **acceptable** arguments, S , as “**good quality**” arguments:
 - S is a **set** of individual (constituent) arguments.
 - Together the arguments in S “**address**” all possible counter-arguments to it.

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Example of Argumentation

- **Arguments** $= \{a1, a2, a3\}$ **constructed** by:
 - $a1 = \{\text{turn_on_switch causes light_on, light_on causes } \rightarrow \text{darkness}\} \cup \{\text{turn_on_switch@T}\}$
 - $a2 = \{\text{power_cut causes } \rightarrow \text{electricity, } \rightarrow \text{electricity implies } \rightarrow \text{light_on}\} \cup \{\text{power_cut@T}\}$
 - $a3 = \{\text{darkness@T implies darkness@T}^+\} \cup \{\text{darkness@T}\}$
- $a1$ **supports** \rightarrow darkness@T⁺; $a3$ **supports** darkness@T⁺
- **Constructed from**: “The power cut had turned the house into darkness. Bob came home and turned on the light switch. ...”

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Acceptability of Arguments

- A set S is an **acceptable** (**admissible**) argument:
 - S is not self-attacking (**conflict-free**).
 - Attacks back all other attacking argument sets.
- A set S is an **acceptable** (**≅admissible**) argument:
 - Any attacking argument A is **not acceptable**:
 - An **acceptable** set D attacks (**defends against**) A .
- A set S is an **acceptable** argument:
 - All argument sets A that attack S are, or **are rendered by S , not acceptable**.

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Acceptability Semantics of AA

- A set Δ is **acceptable relative** to a set Δ'
- **Acc(Δ, Δ')** iff $\Delta \subseteq \Delta'$, or for any A that attacks Δ : there exists D that attacks A such that **Acc($D, \Delta' \cup \Delta \cup A$)**.
- Acceptability: **Acc(-, -)** is its least fixed point.
 - Then, Δ is **acceptable** iff **Acc($\Delta, \{\}$)** holds.
- **Acceptability** \leftrightarrow **Dialectical Argumentation**
 - Consider **attacks** A and **defend** by D .

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Example of Argumentation

- $a1$ **supports** \rightarrow darkness@T⁺; $a3$ **supports** darkness@T⁺
- **Attacks** between arguments = $\{(a1, a3), (a2, a1)\}$
 - $a1$ **attacks** $a3$ but **not** vice-versa
 - “Bob expects the house to come out of darkness”
 - $a2$ **attacks** $a1$ (on light_on) but **not** vice-versa
 - $a2$ **defends** $a3$ against the attack of $a1$
- $\{a3, a2\}$ **acceptable** argument for darkness@T⁺
 - Also $\{a2\}$ **acceptable** but $\{a1\}$ is not acceptable.

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Example of Argumentation

- Suppose now that we **also** have an **argument** that the power cut had ended at T, e.g.:
 - $a4 = \{\text{short_power_cut}@T \text{ implies } \neg \text{power_cut}@T\} \cup \{\text{short_power_cut}@T\}$
- Atts** = $\{(a1, a3), (a2, a1), (a4, a2), (a2, a4)\}$
 - Args $a4$ and $a2$ are **equally strong** on "power_cut"
 - No **preference** between them
 - They **defend** against each other.
- $\{a3, a2\}$ **acceptable** argument for $\text{darkness}@T^+$
- $\{a1, a4\}$ **acceptable** argument for $\neg \text{darkness}@T^+$

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"Debate" Example of Argumentation

- Proposed argument a1:** {Athens should wage war on Thebes as it poses a threat.}
 - Counter-argument a2:** {Sparta will then consider us a threat and will wage war on us.}
 - Defending-argument a3:** {Defend against Sparta with a strong ally, Thebes, an enemy of Sparta.} (Assuming only possible ally is Thebes.)
 - Counter-argument a1:** {Waging war on Thebes prevents Thebes from being an ally.}
 - Hence **a1 is not acceptable** (It is self-defeating).
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C. Computational Argumentation from AI

Logic-Based Argumentation

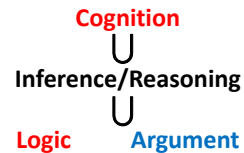
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Logic and Argumentation

Relationship between Logic and Argumentation?



- Can Argumentation form the basis for Logic?
 - For classical consistent reasoning?
 - Beyond, for reasoning with inconsistency, typical of human / cognitive reasoning?

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Logic-Based Argumentation

- In example: "information base" is **inconsistent**.
 - "power_cut" & " \neg power_cut" are **derived/supported**
- Argumentation handles this as **non-determinism**.
 - "power_cut" & " \neg power_cut" are **acceptable**
- Logic-based argumentation in AI:**
 - Uses argumentation for handling **conflicting** information in "classical logical reasoning":
 - Paraconsistent Reasoning.**
 - Belief Revision.**

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Logic and Argumentation

- Logic-based argumentation:**
 - Arguments are built from **Classical Logic**.
 - Logical Reasoning is used to **construct** arguments.
 - Argumentation over Logical Reasoning.**
- Can we have **Logic** built from **Argumentation**?
 - Logical reasoning over Argumentation** (for consistent knowledge).
 - Inference over Argumentation?** (for **inconsistent** knowledge — typical in **human reasoning**).

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Argumentation-Based Logic (AL)

- Arguments in AL built from **core / direct** argument schemas / syllogisms.
 - Same syntax as Classical Logic.
- **Attacking Relation** in AL defined via **direct** derivation of inconsistency / incompatibility.
- **Entailment** in AL via argument **acceptability**:
 - Existence of an acceptable argument for ϕ .
 - **Credulous** entailment.
 - Non-Existence of an argument for $\neg\phi$.
 - **Sceptical** entailment.

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AL is “equivalent” to PL

- AL **equivalent** to PL in “**consistent realm**”.
 - Proof by contradiction \leftrightarrow **self-defeating** arguments.
- AL smoothly extends PL in “**inconsistent realm**”.
- The classical interpretation of \rightarrow is not necessary.
 - Interpretation of \rightarrow in AL is **not material implication**.
- AL is **paraconsistent**: addresses **logical paradoxes**.

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Classical vs Argumentation Logic

- **Classical Logic**:
 - **Strict** and **absolute** reasoning.
 - **Scientific Intelligence**:
 - In Math, Science, and Engineering.
- **Argumentation Logic**:
 - **Flexible** and **defeasible** reasoning.
 - **Natural Common Sense Intelligence**:
 - In Cognitive/Human-level AI.
- AL closer to the **original inception** by Aristotle.

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Argumentation since... Aristotle



*“For every belief comes either through **syllogism** or from **induction**”*

Aristotle, Organon (Prior Analytics II, §23)

Syllogisms (in modern logic: derivations in proof theory), **are in effect basic arguments** for supporting the conclusions they draw. Complex arguments can be built from simpler, basic arguments. Aristotle had attempted to show that all valid arguments can be reduced to his basic forms of arguments.

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C. Computational Argumentation from AI

Preference-Based Argumentation

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Practical Argumentation in AI

- In **structured** argumentation — realizations of abstract argumentation $\langle Arg, Att \rangle$ — we have:
 - **Construction** of arguments in *Arg*
 - **Evaluation** of arguments **against each other**.
- In an AA framework $\langle Arg, Att \rangle$, the attacking relation *Att* captures a “**metric**” of evaluation:
 - If *Att* symmetric, all arguments are acceptable.
 - An asymmetric *Att* gives a **preference/strength**:
 - The attacking argument is **preferred / stronger**.
 - The attacked argument is **weaker** e.g. “**default**”.

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Preference-Based Argumentation

- Structured argumentation frameworks in AI realize the attacking relation through some form of **implicit** or **explicit preference**:
 - ABA — implicit preference rules over assumptions
 - Logic Programming without NAF (LPP)
 - Defeasible Logic (Programming)
 - ASPIC and ASPIC+
 - Value-Based Argumentation — implicit preference
 - ...
- **Preferred** arguments **attack** less preferred ones.

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Example of Argument Preferences

- $a1 = \{\text{turn_on_switch causes light_on, light_on causes } \neg \text{darkness}\}$
- $a2 = \{\text{power_cut causes } \neg \text{electric, } \neg \text{electric implies } \neg \text{light_on}\}$
- $a3 = \{\text{darkness@T implies darkness@T}^+\}$
- **Preferences** through **priorities** on **constituents** of args:
 - light_on causes \rightarrow darkness \gg
darkness@T implies darkness@T⁺
 - \neg electricity implies \rightarrow light_on \gg
turn_on_switch causes light_on
 - **Result:** a1 stronger/attacks a3
a2 stronger/attacks a1
- **Preferences** from **human biases** in **cognition**.

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The Source of Preferences?

For Cognition through Argumentation the preferences over arguments are generally implicit:

- either based on **general principles**;
 - E.g., the strength of causality over persistence.
- or via the **expected outcome** in given context.
 - E.g., in deliberating what action to take.
- or **obtained empirically** from the environment.
 - from which the arguments may also come.

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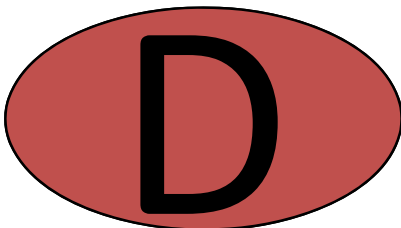
Part C: Summary and Conclusions

- Computational argumentation **unifies** non-monotonic reasoning approaches.
- **Credible alternative** to Classical Logic (CL):
 - Follows a proof-theory approach.
 - Equivalent to CL for “safe” / consistent KB.
- **Explication and persuasion** of inference.
 - For developing trust in a cognitive system.
- In line with strong **evidence from Psychology**:
 - “Why do humans reason? ...”.

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D. Argumentation for Decision Making

Human / Cognitive Decision Making

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Cognitive Decision Making

- Human Decision Making (DM) is a **cognitive process** that results in the **selection of an option** amongst several alternatives:
 - Options can be **Beliefs or Actions**.
 - Selection is based on **Values and Preferences**.
- Human DM is **different** than “scientific” DM.
 - **No optimization** over all options / valuations.
 - “Optimal” solution is **Satisfactory/Persuasive** solution.
 - **Limited or on demand** deliberation of options.
 - Can lead to **undesired** situations: **revision** of decision.

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Forms of Human Decision Making

- We can loosely distinguish **two forms** of DM:
 - **Unconscious DM**: for **concrete decisions**, e.g., moving our hand, turning to see.
 - **Conscious DM**: for **abstract decisions**, e.g., what to wear, what to buy, where to study.
 - **But also comprehension: DM for beliefs.**
 - Unconsciously performed, but can be **consciously reconstructed**: E.g., “The doorbell rang.”
 - **DM: another way to think about Reasoning.**
 - **Logic**: the **Science of Conscious DM**.

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Psychology of Decision Making

- The **phenomenology** of human Decision Making from **empirical psychology** is **rich**, e.g.,:
 - “People tend to accept the **first alternative** that fits the general scheme of a solution”.
 - Also there is a bias towards **initial information**.
 - “People are **pre-disposed** favourably to certain solutions — e.g. from the past.”
 - “**Peer pressure** to conform to group opinions.”
- **Argumentation Logic** from AI can offer a **principled theory** for (conscious) human DM.

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Decision Making in Argumentation

- A **decision problem** consists of:
 - A set of **Options**.
 - A set of **Values** that parametrize the options.
 - A **Valuation**: an ordering, \succeq , on sets of values.
 - **Object level Arguments**: a structure, e.g., a rule of conditions (could be empty) that makes an option available or not in a given problem.
 - **Preferences** that give **relative strength** to the **arguments** for the various options according to:
 - **prefer(arg(Oi),arg(Oj)) if value(Oi) > value(Oj)**

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Decision Making in Argumentation

- **Preferences** that give **relative strength** to args:
prefer(arg(Oi),arg(Oj)) if value(Oi) > value(Oj)
- The value and valuation over options depends on **current external** environment and **current state** (e.g., beliefs) of the decision maker.
 - Preferences can then be **compiled** to:
 - **prefer(arg(Oi),arg(Oj)) if situation_ij**, where “value(Oi) > value(Oj)” holds in **situation_ij**
 - Also, preferences can be **dynamic** and **adaptive**.

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Decision Making in Argumentation

Preferences that give **relative strength** to args:
prefer(arg(Oi),arg(Oj)) if value(Oi) > value(Oj)

- The valuation is done under **partial information** about the instance environment.
 - Can **change/flip** in the light of **more information**.
- Also we may want to simultaneously consider **alternative valuations** (or environments):
- **These lead to: Arguments over Preferences!**
 - **And to: Preferences over Preferences.**

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Decision Making in Argumentation

- **Arguments over Preferences:**
 - p(ij): prefer(arg(Oi),arg(Oj)) if situation_ij
 - p(ji): prefer(arg(Oj),arg(Oi)) if situation_ji
 - In a **common situation** which option to prefer?
 - “Prefer Oi over Oj in c_ij”: **prefer(p(ij), p(ji))** if c_ij
 - “Prefer Oj over Oi in c_ji”: **prefer(p(ji), p(ij))** if c_ji
 - Repeats at a **higher-level** of preferences.
- **Challenge: Cognitive Elicitation of preferences**
 - “**Generally**, in SITUATION prefer Oi, **but** when in **particular** CONTEXT, prefer Oj.”

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Example of DM in Argumentation

Conflict Resolution(USA-China Plane):

- Options for USA: **prop(regret_yihan)**,
prop(regret_bao qian), **prop(apology_bao qian)**
- Values: “**Saving Face**”, “**Conform to Intern. Law**”
- Preferences: According to **Values** which can be **Compiled Preferences**:
“value(regret_yihan) > value(regret_bao qian)”
when “**Saving Face**” is a **dominant** value:
 - prh: prefer(reg_yih, ANY) if **goal(saving_face)**

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Example of DM in Argumentation

Conflict Resolution(USA-China Plane):

- **Compiled Preferences:**
 - value(apology_bao qian) > value(regret_bao qian)
when “**Violation of Intern. Law**” is true
 - pab: prefer(apo_bao, reg_bao) if **violation_norms**
 - **Generally**, prefer options that serve “conforming to international law”, **but** when **disagreement on violation**, prefer options that serve “saving-face”:
 - cd: prefer(pab, prh) if **true**
 - ce: prefer(prh, pab) if **disagreement on violation**
 - hed: prefer(ce, cd) if **true**

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Negotiation and Decision Making

- **Negotiation** important in Conflict Resolution.
- **Negotiation** modeled through **Argumentation**.
 - Dialogue with responses according to **decisions** of their private **argumentation theory** and the **dynamic** information of dialogue environment.
- More information on the Gorgias-B Website.

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Needs and Decision Making

- **Maslow’s Hierarchy of Human Needs**
Physiological > Safety > Affiliation or Social > Achievement or Ego > Self-Actualization or Learning
 - Options: Goals/Actions to set/perform are parametrized by above 5 types of needs.
- Human personalities can be modeled through preference-based argumentation.
 - **Default behaviors:** Selfish, Altruist, etc.
 - But, sensitive to **special circumstances**.

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D. Argumentation for Decision Making

Cognitive Elicitation of Preferences

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Cognitive Elicitation of Preferences

- The link between **Argument** and **Cognition** facilitates the **elicitation** of user preferences.
 - Via a **high-level natural** interaction with user.
- **Direct** and automatic mapping into executable **preference-based argumentation** theory.
- **SoDA methodology** for argumentation and **Gorgias-B** tool support this process.

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The Gorgias-B Website



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SoDA: Cognitive User Interaction

- In the **SCENARIO** are there **OPTIONS** that are **generally PREFERRED**?
 - Are there **special CONTEXTS** where **ANOTHER OPTION** is preferred?
- Example: **Call Assistant**
 - **Generally, when at work prefer to allow calls from family**
 - **But when in an important meeting prefer to hold calls**
 - **Except when there is an emergency at home.**
- **SoDA:** consider successive scenario **refinements**.

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Visit the Gorgias-B Website

- Website contains:
 - Gorgias-B downloads
 - Tutorials and examples
 - Relevant Publications
- Past real-life applications of Gorgias.
 - New applications (Cognitive Systems, Cyber Security)
- <http://gorgiasb.tuc.gr>

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D. Argumentation for Decision Making

Agent Decision Making (one slide!)

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Argumentation and MAS

- Computational argumentation in AI has been widely applied and studied in the context of **Multi-Agent Systems (MAS)**.
 - Agent decision making, agent communication: Dialogues, negotiation, collaboration, ...
- Meant to follow (share elements of) human behavior and cognition. But **traditionally**:
 - Engineering approach / strict requirements.
 - Little, if any, influence from Cognitive Psychology.
 - **But**: recent MAS for social decision making.

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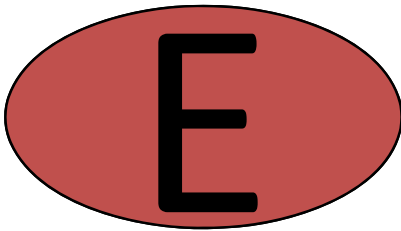
Part D: Summary and Conclusions

- Argumentation can offer a **principled understanding** of Cognitive Decision Making.
 - Compatible with the **lazy feature** of human DM.
 - Compatible with the form of human knowledge often recognized as **compiled knowledge of behavior**, rather than as a scientific theory.
- Context-specific preferences between options / arguments can be **naturally elicited** from ordinary users through a **dialectical process**.

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High-Level Tutorial Roadmap

- A. Motivation and Historical Context
- B. Argument and Cognition in Psychology
- C. Computational Argumentation from AI
- D. Argumentation for Decision Making
- E. **Argumentation for Comprehension**
- F. Acquisition and Learning of Arguments
- G. Thoughts on Computational Cognition
- H. Overall Summary and Conclusions

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E. Argumentation for Comprehension

Reasoning about Actions & Change

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Reasoning About Actions & Change

- Given observations and action occurrences:
 - E.g., power_cut@1, turn_on_switch@2, ...
- Complete what holds across the time line:
 - E.g., \rightarrow light_on@3
- Respecting typical commonsense properties:
 - **Frame**: States (situations) persist across time.
 - **Ramification**: Actions can have indirect effects.
 - **Qualification**: Action effects can be blocked.
 - **State Defaults**: Default states are respected.

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A Cognitive Approach to RAC

- The commonsense properties effectively capture requirements of **comprehension**.
 - **Bridge** disconnected pieces of information.
 - **Elaborate** missing information and predict.
 - **Mental model grounded** on the information.
 - Use the model to **explain** the information.
 - **Revise** the mental model to accommodate surprising information that does not fit it.
- These are the same requirements for **comprehending narratives (or stories)**.

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Comprehension and Argumentation

- Situation / Event Calculus for **“scientific” RAC**.
- But, capture **cognitive RAC** via argumentation:
 - Persistence, Causal, Preclusion, Property, and Assumption arguments (and Observations).
- The natural (partial) priority amongst these
 - Causal > Persistence; Preclusion > Causal;
 - any > Assumption; Persistence > Propertygives a preference-based argumentation framework that addresses the central RAC problems (frame, ramification, qualification).

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Grounded Models and Extensions

- Psychological evidence that humans do not reason by considering all “possible models”, but rather **a single “intended model”**.
- From an AI perspective, mental models can be seen to be close to the reasoning through inference rules, and their resulting arguments.
- Mental model for comprehending a situation:
 - **Comprehension = Grounded Extension of AF**.
 - Where each argument is **grounded** on input.

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Do Grounded Extensions Suffice?

- Argumentation naturally accommodates for:
 - **Elaborate** missing information and predict.
 - **Mental model grounded** on the information.
 - **Revise** the mental model to accommodate surprising information that does not fit it.
- Maybe additional machinery to fully address:
 - **Bridge** disconnected pieces of information.
 - Use the model to **explain** the information.
- **Challenge: coherence, cognitive economy?**

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E. Argumentation for Comprehension

RAC for Narrative Comprehension

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Story / Narrative Understanding

What inferences follow from a story?

Papa Joe woke up early at dawn, and went off to the forest. He walked for hours, until the sight of a turkey in the distance made him stop.

A bird on a tree nearby was cheerfully chirping away, building its nest. He carefully aimed at the turkey, and pulled the trigger of his shotgun.

Undisturbed, the bird nearby continued chirping.

Q1: What is the condition of the turkey?

- (a) Alive and unharmed. (b) Dead. (c) Injured.

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Comprehension Through STAR

scene 1: animal(turkey) at 2. in(turkey,forest) at 2.

scene 2: nearby(bird) at 4. chirp(turkey) at 4.

aim/expectation: animal(turkey) at 2. in(turkey,forest) at 2.

r₁: animal(turkey) at 2. in(turkey,forest) at 2.

r₂: animal(turkey) at 4. chirp(turkey) at 4.

r₃: animal(turkey) at 2. in(turkey,forest) at 2.

r₄: fired_at(G,X) at 4.

r₅: fired_at(G,X) at 4.

r₆: loaded(G,gun(G)) at 4.

r₇: loaded(G,gun(G)) at 4.

Uniform treatment via argument rules.
 Addition of **time** for causality and change.
RAC: inertia, ramifications, state defaults.
 Endogenous and exogenous **qualification**.
implicit

Try it online! <http://cognition.ouc.ac.cy/star>

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STAR's Programming Language

session(s(1), [q(1)], all).

session(s(2), [q(1)], all).

fluents([expect, surprise]).

s(1) :: event at 3.

s(2) :: surprise at 6.

p(1) :: surprise implies -expect.

c(2) :: event, -expect causes surprise.

q(1) ?? surprise at 9; expect at 9.

0:	-expect	
1:	-expect	
2:	-expect	
3:	<event>	-expect
4:	-expect	surprise
5:	-expect	surprise
6:	-expect	<surprise>
7:	-expect	surprise
8:	-expect	surprise
9:	-expect	surprise

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E. Argumentation for Comprehension

Demo of the STAR System

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The STAR System Website



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Aims of the Current Demo

- To illustrate a system for the:
 - Representation** of what needed to comprehend: narratives, questions, and **background world knowledge** in the form of rules (**basic argument parts**) and priorities / preferences among them.
 - Automatic** construction of a **single mental model** for the comprehension of the narrative, and the answering of questions through the model.
 - Ability to **revise model** as the world changes.

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Coherence-Revision Schemas

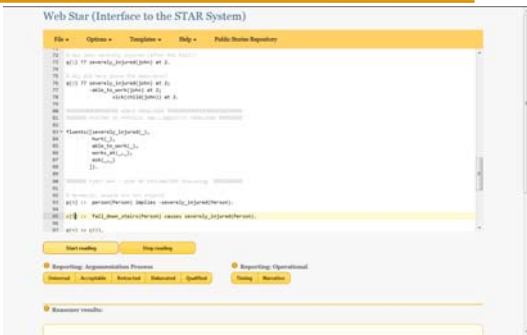
- Coherence & Revision central in comprehension.
 - "minimal" components to understand a story!
- "John fell down the stairs."
 - Predict (?)**: John is lying on the floor.
- "Helen phoned the ambulance service."
 - Bridge**: John is injured severely from falling.
- "She told them that John could not go into work today."
 - Revise**: John is working at the ambulance service. John is not injured severely.

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Web-Star Screenshot: Main View



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How to Approach the Problem?

- How can we derive the **bridging inference** that *“John was severely injured”*?
- This inference **increases coherence** of our understanding and it is more likely that humans will draw compared with the equally valid inferences that *“Helen saw John fall”* or *“Helen and John are at the same place”*, etc. It explains Helen ringing the ambulance, and **links the two sentences together**.
- With the third sentence this **bridging inference is abandoned** as it is **inconsistent** with Helen’s behavior given by the third sentence. We have a **revision** in the comprehension.
- A **new explanation** can be derived to explain the phone call such as *“John is not able to work today”* or that *“John works at the ambulance service”*.

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Example Run of the STAR System

```
s(0) :: person(john) at always.
s(0) :: person(helen) at always.
s(0) :: otherperson(helen,john) at always.
s(0) :: otherperson(john,helen) at always.
s(1) :: fall_down_stairs(john) at 1.
s(2) :: phone(helen, ambulance_service) at 2.
s(3) :: tell(helen, ambulance_service, unable_to_work(john)) at 2.

% Was John severely injured (after his fall)?
q(1) ?? injured(john) at 3;
        severely_injured(john) at 3.

% Why did Mary phone the ambulance?
q(2) ?? severely_injured(john) at 3;
        -able_to_work(john) at 3;
        sick(child(john)) at 3.
```

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Visit the STAR System Website

- Website contains:
 - STAR code download
 - Link to Web-Star interface
 - Tutorials and examples
 - Share your stories!
 - Relevant publications
- <http://cognition.ouc.ac.cy/star>

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Take-Home Exercise!

Coherence-Revision Schema:

- “John run out of the house.”
 - **Predict (?)**: John is outside the house / in a hurry.
- “The fire-engine was approaching.”
 - **Bridge**: Something nearby / John’s house is on fire.
- “The firemen freed John’s cat from the tree.”
 - **Revise**: Nothing nearby is on fire. The fire-engine came to free the cat. John run out because he was worried about his cat / expecting the fire-engine.
- Use the STAR System to **represent** this. **Extend it!**

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Part E: Summary and Conclusions

- Argumentation can offer a **principled method** for constructing a mental model of a situation.
 - Supports **revision**, **grounding**, and **elaboration**.
 - Compatible with the form of human knowledge often recognized as **compiled knowledge of behavior**, rather than as a scientific theory.
- Preferences between types of knowledge follow (mostly!) **naturally** from their type.
 - Although story-specific preferences exist.

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How does Argumentation for Decision Making and Comprehension help with

Cognitive Programming Challenge ?

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Cognitive Programming Challenge

- Programming for the masses through:
 - Cognitive elicitation of user preferences.
 - Natural interaction with the human user.
 - Acquisition through machine learning of relevant background world knowledge.
 - Process should be transparent to the user.
- Cognitive Decision Making & Comprehension form the central metaphor of computation.

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A Overarching Goal / Framework

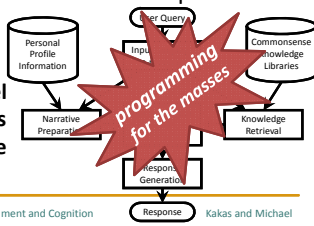
Cognitive Programming via arguments

(adopting the stance taken by Traditional/Old AI)

- What? Help solve certain everyday tasks.
- How? Use the novice assistant metaphor.

Computational Model:

- narrative preparation
- comprehension model
- simple argument rules
- grounded on narrative
- inferential coherence

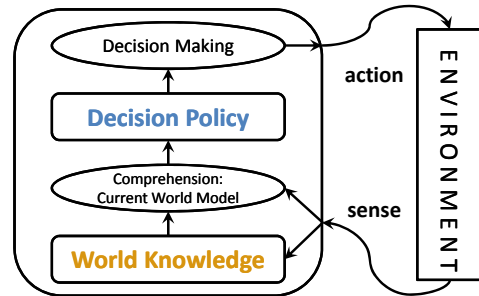


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Cognitive Assistant Bird-Eye View



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Interaction / Programming Modes

Querying: User requests in NL. CA responds by compiling relevant policies and knowledge.

Supervising: User accepts/overrides response.

Personalizing: User offers statements and preferences in NL. CA transforms and stores.

Guiding: User suggests relevant concepts in NL.

Instructing: User offers / programs knowledge directly in CA internal representation language.

deeper / closer to machine

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Bob's Work-Appointment Assistant

- **Bob guides:** "dinner plans, family time, work appointments, dietary constraints".
- CA gathers relevant commonsense knowledge.
- **Bob queries:** "vegetarian restaurant nearby".
- If repeated, CA learns that "Bob eats healthy".
- **Bob supervises:** typically declines suggestions from CA for "late dinner outside his house".
- CA learns "Bob likes to be home at evenings".

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Bob's Work-Appointment Assistant

- **Bob personalizes:** "Customers are important", "Never miss my children's birthday parties".
- CA transforms and stores in Bob's profile.
- **Query from boss:** "Working dinner today".
- CA constructs comprehension model; rejects!
 - "Normally, working dinners are at restaurants".
 - "Normally, dinner is in the evening".
 - But, "Bob likes to be home at evenings".
 - Possibly suggest "Invite boss home for dinner".

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Bob's Work-Appointment Assistant

- **Query from boss:** "Working dinner today".
- CA constructs comprehension model; rejects!
 - Today's calendar: Bob's wedding anniversary.
 - "Normally, anniversary is celebrated privately".
 - Offer knowledge as explanation for response.
- **Query from boss:** "Coming with customers".
- CA revises comprehension model; accepts!
 - Supported by Bob's preferences.
 - Reschedule wedding anniversary celebration.

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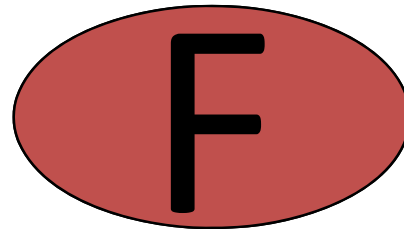
Cognitive Programming Challenges

- **Cognitive elicitation of user preferences.** (How can the system help the user?)
 - More natural elicitation in natural language?
 - System proposes revised scenarios / contexts?
 - Elicitation without active user involvement?
- **Acquisition** through machine learning of relevant background **world knowledge.** (How can the user help the system?)
 - User proposes vocabulary / hypothesis bias?
 - User curation of the data or the knowledge?

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High-Level Tutorial Roadmap

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F. Acquisition and Learning of Arguments

Cognitive Knowledge from Corpora

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Cognitive Program Acquisition

- Users **supervise, personalize, guide, instruct, ...**
- Generic world knowledge:
 - **autodidactic** continuous background learning
 - **from text**; plentiful, parsers, human-specific
 - **using the Web** as the source of training data
- User-specific preferences:
 - **passive elicitation** of user-specific preferences
- Possibly **multiply-represented**: *argument rules*

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Argument Mining

- **Argument Mining**: An area in AI aiming to extract a **argumentation structure** from **native** human debates, dialogues, or reviews on social networks and other fora (that primarily use text).
 - Apply some **formal analysis** of the data.
- **Explicit argumentation** in human reasoning.
- The data is **unstructured** and “free-range”.
 - In its **natural** form of **human reasoning** & debate.
- Helps understand the **links** between **Argument** and **Cognition**.

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Example of Argument Mining

- Example Approach: **Bottom-up Argumentation**
 - **Avoid** any top-down intervention by “argumentation engineers”.
 - **Preserves** the **naturalness** of data and reasoning.
 - **Identifies** in data:
 - Comment, Opinion, Support, Objection (Contrary).
 - **Translates** data into Assm.-Based Argumentation.
 - ABA semantics informs on the “**quality**” of opinions.
- **Importance**: analysis and evaluation of models of computational argumentation for cognition.

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Statements, Arguments, Experiences?

Statement: a **predicate** on **specified** entities.

“The Hague is in Holland.”

ASK: Is it true? What other facts can it help identify?

Argument: a **rule formula** on **abstract** entities.

“A large city is more likely to host an international event.”

ASK: Is it valid? What if it conflicts with other rules?



Experience: **predicates** on **specified** entities.

“The Hague is hosting ECAI 2016, an international event.”

ASK: With what rules (in some class) is it consistent?

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From Common to Web Sense

- **websense**: The “commonsense”-like type of knowledge encoded in the Web, including:
 - expert knowledge (fever near a swamp \approx malaria)
 - cultural biases (if visiting, bring bottle of wine)
 - misconceptions (correlation implies causation)
 - fictional statements (the fox served the crane soup)
 - deliberate lies (heavy smoking is good for you)

Challenge: Argumentation allows system to explain a wrong inference, and user can “correct” the system.

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Arguments in Learned Definition

- NL query : “members share something”
- logic form : *member(1), something(3), share(1,3)*
- websense : *(in the context of “spyware”)*

<i>file(x) \leftrightarrow</i>	<i>threshold(1.0)</i>	<i>% pos:1852 neg:1831</i>
<i>$\exists v : scan(v,x) \wedge rogue(v)$</i>	<i>weight(0.962710)</i>	<i>% pos:16 neg:1</i>
<i>$\exists v : share(v,x)$</i>	<i>weight(1.627098)</i>	<i>% pos:11 neg:1</i>
<i>$\exists v : have(x,v) \wedge program(v)$</i>	<i>weight(0.645691)</i>	<i>% pos:19 neg:0</i>
<i>$\exists v : open(v,x)$</i>	<i>weight(1.593269)</i>	<i>% pos:27 neg:2</i>

• inference : *file(3)*

• NL answer : “something is a file”

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From Implicit to Explicit Arguments

- $r_1: Penguin \Rightarrow \neg Flying$, $r_2: Bird \Rightarrow Flying$, $r_1 > r_2$
Formula: $(U \vee Bird) \wedge \neg Penguin \leftrightarrow Flying$
 - Good on “full” scenes. Still abstains on $\{\neg P, \neg B\}$.
 - Infers too little... Does not infer F on $\{B\}$. **Bad!**
- $r_1: b \Rightarrow a$, $r_2: \neg b \Rightarrow a$ Formula: $T \leftrightarrow a$
 - Infers too much... a by case analysis on $\{b\}$. **Bad!**
- NP-hard reasoning. Still not 1 rule/atom. **Bad!**
- **Thus:** explicit arguments & preferences!

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F. Acquisition and Learning of Arguments

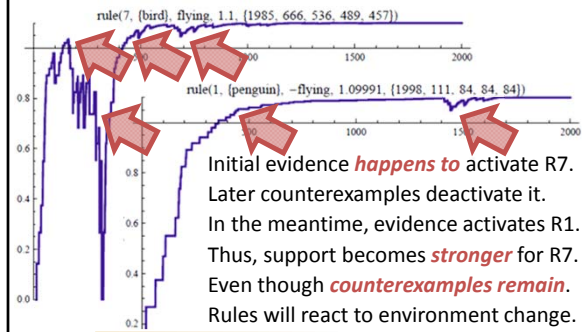
Argument and Preference Learning

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Never-Ending Rule Discovery

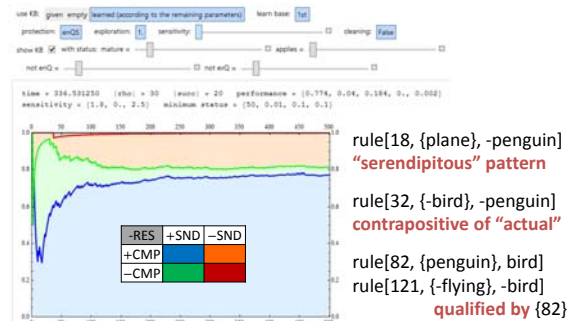


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“External” Argument Evaluation

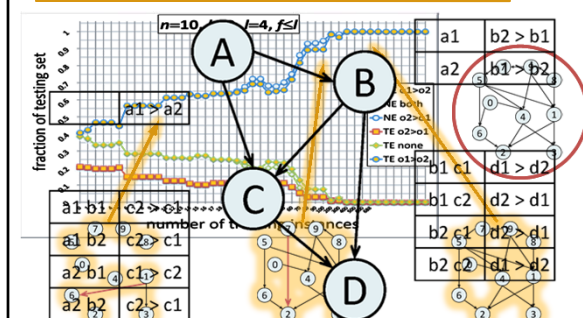


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Passive Preference Elicitation



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Novel Metrics of Evaluation?

- Do the traditional (scientific) metrics suffice?
 - **Soundness:** against “real life” even if not seen.
 - **Completeness:** do not abstain from predicting.
- Not objective correctness of prediction, but **subjective persuasiveness** of explanation.
 - Is the **particular** human user **persuaded** for the inference / decision given by the **arguments**?
 - Importance of **interaction / dialogue** for learning.
 - Bias towards inferences that are **justified easily**.

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Crowdsourcing Arguments?



- One way to ensure persuasiveness is to involve actively human users in the acquisition loop.
 - Recall that humans can also supervise learning.
 - Crowdsourcing Knowledge Acquisition GWAP.
 - Player sees short stories with questions.
 - Constructs simple rules to answer questions.
 - Evaluates appropriateness of rules by others.
 - Resolves conflicts by specifying preferences.
- Play at:** <http://cognition.ouc.ac.cy/robot>

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Computational Considerations

- **Reading Between the Lines**
 - Learn what is **implied** but is not stated in text.
- Employ “Static” and **Causal Learnability**
 - Important for **coherence** in comprehension.
- Learn via **Introspective Forecasting**
 - Learn the **effects of using** learned knowledge.
- **Simultaneous Learning and Prediction**
 - Coupling **provably useful**. Bounded chaining.
- **Jumping to Conclusions** for reasoning
 - Argument-based, but **less rigid** and **learnable**.

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Part F: Summary and Conclusions

- Arguments, and preferences between them, can be **automatically extracted from text** through argument mining / machine learning.
 - Necessary to gather **sufficient knowledge**?
 - Only way to offer “**external**” evaluation?
- **Involvement of humans** is still important:
 - **Reduce deficiencies** due to biased corpora.
 - Provide **user-specific** input for **preferences**.
 - Provide knowledge on **collective beliefs** that possibly cannot be known by any single user.

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High-Level Tutorial Roadmap

- A. Motivation and Historical Context
- B. Argument and Cognition in Psychology
- C. Computational Argumentation from AI
- D. Argumentation for Decision Making
- E. Argumentation for Comprehension
- F. Acquisition and Learning of Arguments
- G. Thoughts on Computational Cognition**
- H. Overall Summary and Conclusions

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- G. Thoughts on Computational Cognition**
- Features of Cognitive Effectiveness

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On Cognitive Effectiveness

More speculative in relation to earlier parts!

Stemming from the **view of Cognition** from the perspective of **Computational Argumentation**.

- Why is Cognition Effective?
 - Natural Human intelligence stems out of the effectiveness of cognition / human reasoning.
- Need to consider the effectiveness of cognition if we are to understand the nature of human reasoning.

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Why is Cognition Effective?

- Cognition is based on **default** inferences:
 - Acquired through **experience**. Good “bet” in **stable** environments. **Recovery mechanism** for surprises.
- Default Experience is **extensionalized**:
 - **Cognitive Knowledge** compiled into knowledge that can be **grounded** directly to external information typically coming from environment. E.g., conforming to our Language Vocabulary.
- Cognition is **effectively cautious**:
 - **Lazily** waits for information to **ground** default knowledge to past experience.

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What is Cognitive Knowledge?

- “**world behavior rules**” vs **Scientific Knowledge**:
 - Behavioral vs Explanatory (i.e., Scientific).
 - Compiled vs General Theory:
 - Non-causal and Causal knowledge:
 - fire_engine_arriving **implies** house_on_fire
 - house_on_fire **causes** fire_engine_arriving
 - Extensional vs Intensional:
 - forest_on_fire **causes** fire_engine_arriving
 - on_fire(X) **causes** fire_engine_arriving_at(X)
 - **RAC** is a good example for these **distinctions**.

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What are Cognitive Preferences?

- Preferences are also “**world behavior rules**”:
 - Defaults are expression of **world preferences**!
 - **Personal preferences** may stem from **higher-level values** of a person, but are used in a **compiled** form as world behavior rules.
 - E.g., in **justification** of decisions / conclusions.
- Preferences themselves are also **defeasible**.
 - Can be reasoned with and argued about.
 - How many **levels (of exceptions)** can this defeasibility reach in natural cognition?

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Aspects of Compiled Knowledge

Strong bias so that reasoning can be **effective**.

- Strong **propagation** with possible **inhibition**, without forced consideration of **qualifications**.
“turn_on_switch, **electricity**, ... **causes** light_on”
- Knowledge compiled into **several** connections:
 - “Redundancy” helps **utility** and **effectiveness**.
cross_line **then** invalid_jump
not cross_line **then** valid_jump
invalid_jump **then** not measure_jump
measure_jump **then** valid_jump

Proof by
Contradiction
(Modus Tollens)

Non-Causal
Explanations
from Causality

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Supporting Theoretical Evidence

*Under certain assumptions, one can formally prove, or provide strong indications, that **when***

- arguments have **many levels of exceptions**
 - or, argument rules have **many preconditions**
 - or, arguments require **chaining many rules**
- then, (in the worst-case)** learning or reasoning
- becomes computationally **intractable**
 - Or, has **low soundness / completeness**.

“many” ≈ anything more than a small integer.

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G. Thoughts on Computational Cognition

Hardware Cognitive Architectures

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New Cognitive System Substrate?

- Existing hardware: von Neumann architecture.
 - Ideal for reasoning in classical logic.
- Ongoing efforts: neural-based architectures.
 - Geared towards image-recognition, etc.
- Is there a need for an **intermediate solution**?
 - Spreading activation like neural-based.
 - Symbolic reasoning like von Neumann.
 - Accommodating preferences and defaults.

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Argumentation & Effective Cognition

- Argumentation** offers a **computational model** for Human Reasoning as a process of **supporting a position**:
 - Activation / Inhibition** via (counter-)arguments.
 - Acceptable** Argument \leftrightarrow **Threshold Activation** from positive and negative feeds, as observed in neural activation in **brain operation**.
- Can we form a **Hybrid** (symbolic and connectionist) **architecture** of computation?

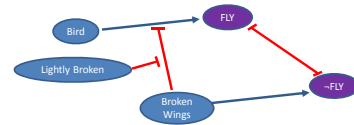
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Argumentation for Human Reasoning

- Context: “birds, wings, and flying” in LPP (LPwNF)



- Is this an accurate reflection of the **mind**?
- Is this an accurate reflection of the **brain** and its neural circuits?
- Cf. Genetic and Signal Pathways in Molecular Biology.

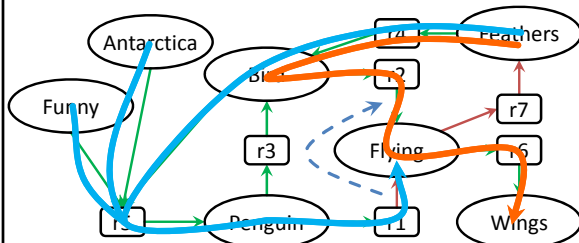
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Fast and Loose Argumentation

This animal has Feathers, lives in Antarctica, and looks Funny. **Question:** Does it have Wings?



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Part G: Summary and Conclusions

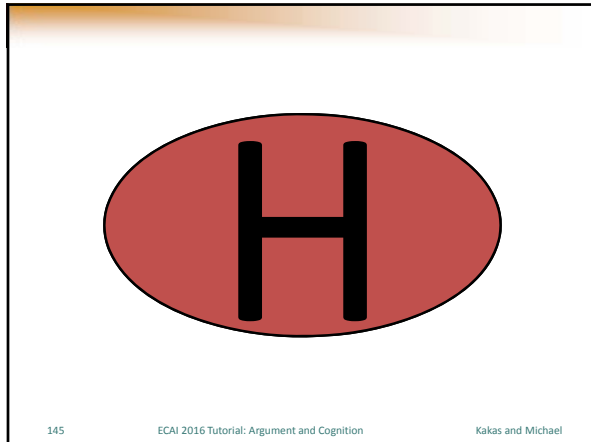
Argumentation for principled understanding of Cognitive Reasoning, using “Logic of Arguments”.

- Compatible with features of human cognition:
 - Following biases from previous experience.
 - Employing lazy, on demand, computation.
- Compatible with a form of human knowledge often recognized as compiled knowledge of (expected, appropriate) behavior, rather than a general intensional (scientific) theory.

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H. Overall Summary and Conclusions

Concluding Thoughts

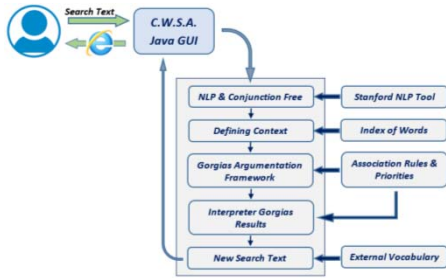
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- ## Summary and Conclusions
- There is a close link between **Argument** and **Cognition**. At different **levels/types** of cognition:
 - Seemingly **effortless** text comprehension.
 - **Conscious** decision making.
 - Strong evidence from **Psychology**:
 - Away from classical **exhaustive** reasoning to **supporting** a conclusion/position.
 - We have also provided **anecdotal evidence** that argumentation can **match features** of cognition:
 - **Limited** or **On Demand** deliberation.
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- ## Summary and Conclusions
- Linking **Cognition** with **Argumentation** from **AI**:
- Principled **scientific theory** for symbolic Cognition.
 - Basic notion of **acceptability** of argument.
 - **Computational model** of Cognition:
 - **Cognitive Knowledge** in **argumentation form**.
 - Matches **observed** features of **process** of cognition.
 - **Compatible** with **brain** neural threshold **activation**.
 - Close to **production systems** with a principled handling of **conflict** and **revision**.
 - **Logic of Arguments: Argumentation Logic**.
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- ## Summary and Conclusions
- Motivated by context of **Cognitive Systems**.
 - **Comprehension** central **architect. component**.
 - **Cognitive Programming** paradigm:
 - **Cognitive Elicitation** of personal preferences.
 - **Acquisition** of general knowledge preferences:
 - Preference of association: **default** associations.
 - **Require: Machine Learning** from **Experience**:
 - Learning **argumentation** theories.
 - **Demo: Cognitive Web Search Assistant**
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Cognitive Web Search Assistant



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Google Queries \Rightarrow ?????? Queries

- All Google queries have already been posed!
 - In Cognitive Systems can they be **extensionalized**?
 - **Compiled** from the “experience” of past queries?
- **Cognitive Search Assistants for Human-like queries!**
 - **Personalized & Extended Form, Story-like queries.**

“Places to celebrate our wedding anniversary. Our Italian friends will be joining us, with their children. It is the first time their children are visiting us.”

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Summary and Conclusions

- **Cognitive vs Scientific Reasoning:**
 - Knowledge: **Default** vs Definitional
 - Solution: **Satisfactory** vs Optimal
 - Learning: **Experience** vs Didactic
 - Computation: **Flexible** vs Rigid
- **Argumentation Logic vs Classical Logic**
- **Contrast** reveals **link** of Argument & Cognition.

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Overall Conclusion

- Argumentation can help us **understand** the nature of human reasoning — cognition.
 - Computational nature of cognition.
- Argumentation can provide a **principled (scientific) foundation** for Cognitive Systems.
 - Human machine symbiosis.

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Acknowledgments

- **Irianna Diakidoy**
Dept. of Psychology,
University of Cyprus, Cyprus
- **Hugo Mercier**
Centre de Sciences
Cognitives, Université de
Neuchâtel, Switzerland
- **Pavlos Moraitis**
LIPADE, Paris Descartes
University, France
- **Nikos Spanoudakis**
Technical University of
Crete, Greece
- **Francesca Toni**
Dept. Computing, Imperial
College London, UK
- **Rob Miller**
Dept. Information Studies,
University College London, UK
- **Gyorgi Turan**
MSCS, University of Illinois at
Chicago, IL, USA
- **Bob Kowalski**
Dept. Computing, Imperial
College London, UK

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Slides, systems, and papers will be available online through:
<http://cognition.ouc.ac.cy/argument>

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H. Overall Summary and Conclusions

Demo of Cognitive Call Assistant

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The Gorgias-B Website



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Aims of the Current Demo

- To illustrate a methodology for the:
 - Elicitation of problem / user preferences via a high-level and cognitively-natural interaction of the system with the expert / user.
 - Automatic and direct translation into an (executable) argumentation theory capturing the high-level specification of the expert / user.

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SoDA: Cognitive User Interaction

- In the SCENARIO are there **OPTIONS** that are **generally PREFERRED**?
 - Are there **special CONTEXTS** where **ANOTHER OPTION** is preferred?
- Example: **Call Assistant**
 - **Generally, when at work prefer to allow calls from family**
 - **But when in an important meeting prefer to hold calls**
 - **Except when there is an emergency at home.**
- **SoDA: consider successive scenario refinements.**

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Scenario for Mary's Call Assistant

Mary, "a conscientious employee", wishes to train a personal assistant to manage her calls. Her call assistant can: **allow** the phone to ring, **deny** the call **without an explanation**, or **deny** the call **explaining** the reason for this.

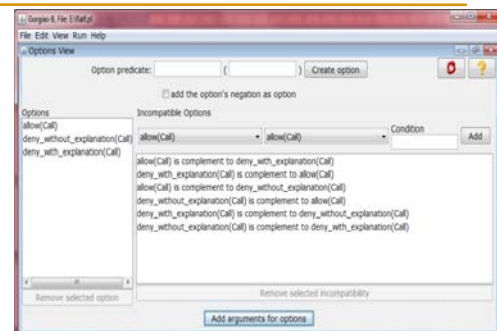
- **Generally**, Mary prefers to allow calls.
- However, if she is **at work**, she prefers to deny calls (with or without explanation).
- When **friends** call she prefers to deny the call with an explanation.
- When she is **at work** she prefers to allow **family** calls over denying them, except when she is **in a meeting**, when she prefers to deny with explanation over allowing the call.
- But if there is **family emergency** (e.g., son at school and — she believes — is ill), she prefers to accept a family call.

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Gorgias-B Screenshot: Options View



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Preferred Options in Contexts

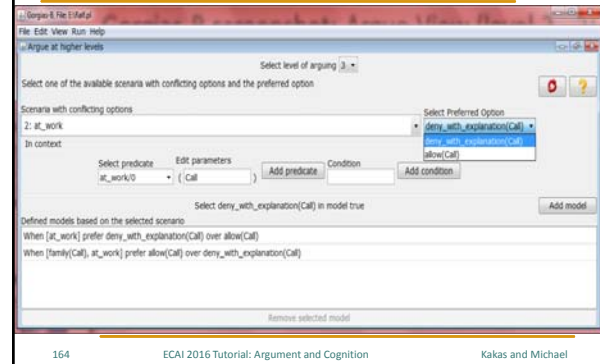
- Scenario 1: **at_work**
 - ...Generally, when **at work**, deny calls (with or without explanation) ...
 - ... **But**, prefer to allow **family calls** over denying them (with or without explanation) ...

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Gorgias-B Screenshot: Argue View



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Preferred Options in Refined Contexts

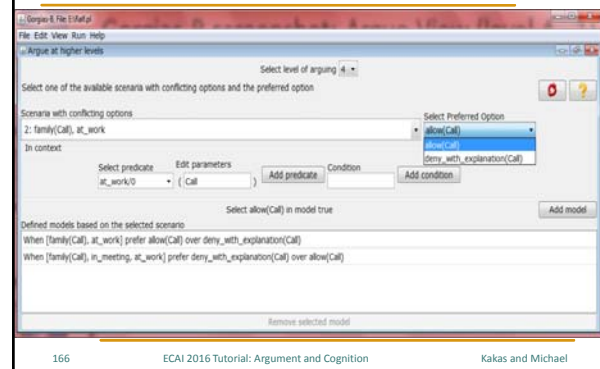
- Refined Scenario 1.1: **at_work, family(Call)**
 - ...Generally, when **at work** prefer to allow **family calls** over denying them (with or without explanation) ...
 - ...**except**, when **in a meeting**, when she prefers to deny with explanation over allowing a call...

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Gorgias-B Screenshot: Argue View



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Using the Call Assistant

- Check the assistant's behavior on a scenario.
- Get **hypothetical** scenario where a certain option is chosen.
- Solutions given by Call Assistant are **justified**.
 - Can be used to **persuade** the human user and / or **train** further the assistant.

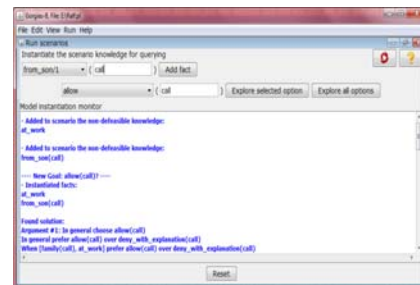
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Gorgias-B Screenshot: Execute View 1

Consider the scenario: **{at_work, from_son(call)}**



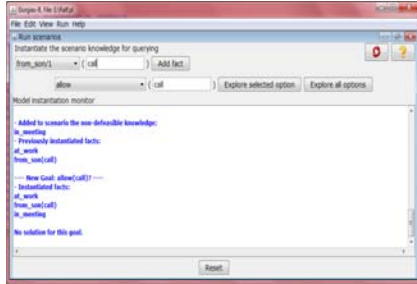
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Gorgias-B Screenshot: Execute View 2

Extend the scenario: {at_work, from_son(call), in_meeting}



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Explaining / Justifying Decisions

- Gorgias **explains** decisions that are arrived at.
- It does **not explain** (yet) reasons for **failing** to draw a different decision.
 - To see this explanation one needs to check the **complementary decisions (explore all options)** and see the reasons that they are derived.

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Take-Home Exercise!

A **Request Assistant** to manage **requests** for resources. It can **challenge**, **accept**, or **refuse** a request, as follows:

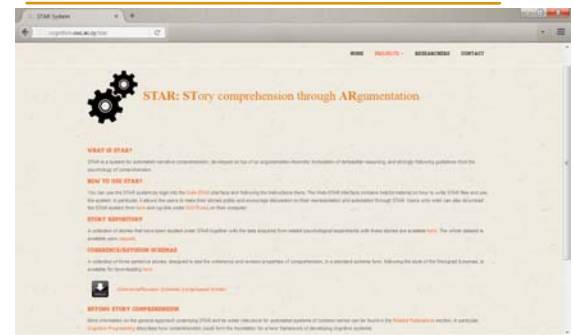
- Normally, **challenge** a request from another agent for a resource.
 - If you need the resource yourself **refuse** the request unless the request is for a common project.
 - If the request comes from your manager you **accept** to give it except when you are already using it. When your manager is abroad you **challenge** a request from him/her.
- Use Gorgias-B to **capture** and **test** this. **Extend** it!

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The STAR System Website



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Aims of the Current Demo

- To illustrate the key points of:
 - The link between **comprehending** the external world and how this comprehension **affects** the decision making of a Cognitive Assistant.
 - The (need for) **adaptiveness** of the decision making process as the world changes / evolves.
 - Compare with the Gorgias-B call assistant.

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Call Assistant Specific Policy

- Generally, allow calls.
- Reject calls **when in transit** and inform user later, with priority for **important** calls.
- Reject calls **while in a meeting**, but allow **important** calls, such as **emergency** calls.
- When **busy** reject all calls except **important** ones.
- These **fluents / concepts**:
 - Need **common sense reasoning** to be understood.
 - Can **change** over time by internal/external actions.

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Call Assistant Policy Structure

When CALL(Parameters)
while SCENARIO/CONTEXT
then prefer ACTION
except when STATE(User/Caller)
then prefer ALTERNATIVE-ACTION.

- **Priorities** capture preferences when there is more than one policy rule with the same CALL arguments or SCENARIO/CONTEXT, but different ACTION.
- **Except-when** are written as **separate** policy rules with the same arguments adding an extra PERSON-STATE argument. **Priorities** need to be specified like before.

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Available Options / Actions

- Allow incoming call (**allow**)
- Reject incoming call (**reject**)
 - ... and inform user later (**reject/inform**)
 - ... and inform user with priority (**reject/priority**)
 - ... and do not inform user (**reject/ignore**)

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Example Scenario 1

"The user is on their way to work, and receives a call from a coworker and a call from a superior."
Expected behavior: Both calls are rejected, but the superior's call receives priority.

Relevant policy rules:

1. When **anybody/any/any** calls, then allow.
2. When **anybody/once/any** calls while in transit, then reject/inform.
 - a. Prioritize (2) over (1).
3. Except when **important person/once/any** calls, then reject/priority.
 - b. Prioritize (3) over (2), (1).

Mapped directly to STAR System code.

The call assistant is able to:

- **Apply** the user policy.
- **Recognize** the notion of an **important call, using the common sense knowledge** that "Normally, calls from superiors are important".

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Example Scenario 2

"The user is at a meeting with a superior, and receives a call from their spouse and a call from a superior."
Expected behavior: The call from the spouse is rejected, and the call from the superior is allowed.

"The spouse calls again."

Expected behavior: The call from the spouse is allowed this time.

Relevant world knowledge:

- Repeated calls might indicate emergency.
- Emergency calls are important.

The call assistant is able to:

- **Adapt** to changes happening in the world, without change in policy.
- Make decisions based on **common sense reasoning**.

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Example Scenario 3

"The user asks not to be disturbed, and receives three calls: from a coworker, a superior, and an expected call from a client."
Expected behavior: The call from the coworker is rejected, while the call from the superior and the expected call are both allowed.

Relevant policy rules: While user is **busy**, then reject/inform.

Relevant world knowledge:

- Calls from superiors are important.
- Expected calls are important.
- Busy user when ... does not want to be disturbed!

The call assistant is able to:

- Make decisions based on **common sense reasoning**.

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end

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