Reasoning with Ontologies for Non-Player Character Decision-Making in Games EXAG - AIIDE 2022, Cal Poly Pomona, USA

PhD Student: Sylvain LAPEYRADE Supervisors: Christophe REY, Bruno BACHELET, Loïc YON

LIMOS - Clermont Auvergne University, France

24 october 2022







Context: The strategic reasoning of virtual agents is often poor

¹From reference books in Game AI: Yannakakis and Togelius [2018], Millington [2019] and review article: Simonov et al. [2019]

Sylvain LAPEYRADE (PhD)

Context: The strategic reasoning of virtual agents is often poor

Game AI behavioural techniques state of the art¹

- Ad hoc algorithms (Hard-coded, poor reusability)
- Finite-State Machines (Hard-coded, poor scaling)
- Behavioural Trees (Hard-coded, poor scaling)
- Utility-based AI (Tuning utilities can be laborious)
- Action Planning (Difficult to use, can be expensive)
- Learning-based AI (Resource intensive, black box)

¹From reference books in Game AI: Yannakakis and Togelius [2018], Millington [2019] and review article: Simonov et al. [2019]

Sylvain LAPEYRADE (PhD)

Context: The strategic reasoning of virtual agents is often poor

Game AI behavioural techniques state of the art¹

- Ad hoc algorithms (Hard-coded, poor reusability)
- Finite-State Machines (Hard-coded, poor scaling)
- Behavioural Trees (Hard-coded, poor scaling)
- Utility-based AI (Tuning utilities can be laborious)
- Action Planning (Difficult to use, can be expensive)
- Learning-based AI (Resource intensive, black box)

Obversation: Logic-based methods are almost absent from SOTA

¹From reference books in Game AI: Yannakakis and Togelius [2018], Millington [2019] and review article: Simonov et al. [2019]

Sylvain LAPEYRADE (PhD)

Perspective: Is the trend changing?

Sylvain LAPEYRADE (PhD)	
Reasoning with Ontologies for NPC Decision-Making in Games	5

LIMOS
3 / 11

Perspective: Is the trend changing?

Recent projects using logic-based methods

- Versu, Evans and Short [2014]
- MKULTRA, Horswill [2015]
- EmbASP, Calimeri et al. [2018]
- UnityIIS, Brännström and Nieves [2021]
- VEsNA, Gatti and Mascardi [2022]
- ThinkEngine, Angilica et al. [2022]

Perspective: Is the trend changing?

Recent projects using logic-based methods

- Versu, Evans and Short [2014]
- MKULTRA, Horswill [2015]
- EmbASP, Calimeri et al. [2018]
- UnityIIS, Brännström and Nieves [2021]
- VEsNA, Gatti and Mascardi [2022]
- ThinkEngine, Angilica et al. [2022]

Obversation: This is not yet adopted by the general industry.

Declarative logic programming helps intuitive rules representation:

```
Transformation of a game rule
```

From our game prototype: "A **human** in the same room as a **monster** or a **pit**, dies"

Listing 1: The same rule in Prolog

LII	M	OS	
4		11	

Ontologies and Knowledge Inference

- 1 X is an element if X is an object or a being
- **2** X is a being if X is an <u>animal</u> or a <u>monster</u>
- **3** X is a <u>monster</u> if X is a dragon
- **4** X is an <u>animal</u> if X is a dog

Listing 2: Simple Ontology in Prolog

```
element(X):- object(X). %1
element(X):- being(X). %1
being(X):- animal(X). %2
being(X):- monster(X). %2
monster(X):- dragon(X). %3
animal(X) :- dog(X). %4
```

LII	M	os	
-			

The *Well-Founded Semantics* (WFS) from Van Gelder et al. [1991] is a 3-valued version of the *Stable Model Semantics* from Gelfond and Lifschitz [1988] which uses *Negation as Failure (NAF)*.

The *Well-Founded Semantics* (WFS) from Van Gelder et al. [1991] is a 3-valued version of the *Stable Model Semantics* from Gelfond and Lifschitz [1988] which uses *Negation as Failure (NAF)*.

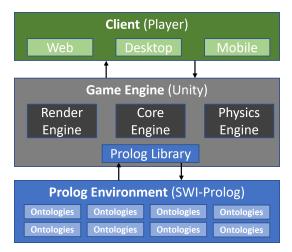
- In the WFS a proposition can be true, false or undefined
- Undefined values are used for ignorance or contradictory info

The *Well-Founded Semantics* (WFS) from Van Gelder et al. [1991] is a 3-valued version of the *Stable Model Semantics* from Gelfond and Lifschitz [1988] which uses *Negation as Failure (NAF)*.

- In the WFS a proposition can be true, false or undefined
- Undefined values are used for ignorance or contradictory info

Listing 5: Use of the Well-Founded Semantics in SWI-Prolog

```
1 is_true(Atom):- call_delays(Atom, true).
2 is_false(Atom):- \+ Atom.
3 is_undefined(Atom):-
4 call_delays(Atom, Condition),
5 Condition \== true.
```



Architecture of the integration of a logic programming environment in a game engine

Sylvain LAPEYRADE (PhD)	
Reasoning with Ontologies for NPC Decision-Making in Games	

Connecting Prolog to Unity seems like a recurring endeavour:

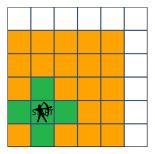
- **SwiPICs** "official" SWI-Prolog interface, *last updated 2013* github.com/SWI-Prolog/contrib-swiplcs
- UnityProlog Ian Horswill, *last updated 2017* github.com/ianhorswill/UnityProlog
- **BackTraQ** "Prolog like", last updated 2019 github.com/FacticiusVir/BacktraQ
- Yield Prolog "Prolog like", last updated 2019 sourceforge.net/projects/yieldprolog
- **CSharpProlog** J.Pool & J.Sakamoto, *last updated 2020* github.com/jsakamoto/CSharpProlog
- Pengines.Client F# alternative, last updated 2021(!) github.com/ninjarobot/Pengines.Client

Connecting Prolog to Unity seems like a recurring endeavour:

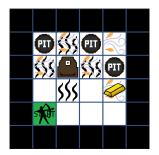
- SwiPICs "official" SWI-Prolog interface, *last updated 2013* github.com/SWI-Prolog/contrib-swiplcs
- UnityProlog Ian Horswill, *last updated 2017* github.com/ianhorswill/UnityProlog
- **BackTraQ** "Prolog like", last updated 2019 github.com/FacticiusVir/BacktraQ
- Yield Prolog "Prolog like", last updated 2019 sourceforge.net/projects/yieldprolog
- **CSharpProlog** J.Pool & J.Sakamoto, *last updated 2020* github.com/jsakamoto/CSharpProlog
- Pengines.Client F# alternative, last updated 2021(!) github.com/ninjarobot/Pengines.Client

No entirely satisfying solution... so we build our own interface: github.com/sylvainlapeyrade/mqi_csharp

Prototype: Wumpus World²



(a) View of the Agent



(b) View of the world

Principle of Wumpus World

An agent explores a cave, finds the gold and leaves without dying.

²Example extended from Russell and Norvig [2021], and Warren [1999]

Sylvain LAPEYRADE (PhD)

Listing 6: Human agent knowledge of the world

```
1
   visited(1, 1). visited(1, 2). visited(2, 1).
2
   visited(2, 2). stench(2, 2).
3
4
   safe(X, Y):- tnot(monster(X, Y)).
5
   safe(X, Y):- tnot(pit(X, Y)).
6
   safe(X, Y):-visited(X, Y).
7
   safe(X, Y):-neighbor(X, Y, X2, Y2),
8
                 visited(X2, Y2),
9
                 no breeze(X2, Y2),
10
                 no stench(X2, Y2).
```

Listing 7: Prolog query for monster given new knowledge

Sylvain LAPEYRADE (PhD)

Reasoning with Ontologies for NPC Decision-Making in Games

LIMOS

Current work

- Improve the prototype to enable even more complex behaviour, espcially in MAS context
- Better formalise the creation and interaction with ontologies

Sylvain LAPEYRADE (PhD)
Reasoning with Ontologies for NPC Decision-Making in Games

Current work

- Improve the prototype to enable even more complex behaviour, espcially in MAS context
- Better formalise the creation and interaction with ontologies

Future work

- Integrating and testing AI in Wako Factory's commercial game
- Making Logic Programming easier to use for game designers outside academia

Current work

- Improve the prototype to enable even more complex behaviour, espcially in MAS context
- Better formalise the creation and interaction with ontologies

Future work

- Integrating and testing AI in Wako Factory's commercial game
- Making Logic Programming easier to use for game designers outside academia

Thank You!

sylvain.lapeyrade@uca.fr

Sylvain LAPEYRADE (PhD)

Denise Angilica, Giovambattista lanni, and Francesco Pacenza. Declarative ai design in unity using answer set programming. In 2022 IEEE Conference on Games (CoG), pages 417–424, 2022. doi: 10.1109/CoG51982.2022.9893603.

- Andreas Brännström and Juan Carlos Nieves. UnityIIS: Interactive Intelligent Systems in Unity. 12 2021. URL https://git.io/JMpzr.
- Francesco Calimeri, Stefano Germano, Giovambattista Ianni, Francesco Pacenza, Simona Perri, and Jessica Zangari.
 Integrating rule-based ai tools into mainstream game development. In *RuleML+RR*, 2018.
- Richard Evans and Emily Short. Versu, 2014. URL https://versu.com.

Andrea Gatti and Viviana Mascardi. Towards VEsNA, a framework for managing virtual environments via natural language agents. *Electronic Proceedings in Theoretical Computer Science*, 362: 65–80, jul 2022. doi: 10.4204/eptcs.362.8. URL https://doi.org/10.4204%2Feptcs.362.8.

- Michael Gelfond and Vladimir Lifschitz. The stable model semantics for logic programming. pages 1070–1080. MIT Press, 1988.
- Ian Horswill. Mkultra (demo). Proceedings of the AAAI Conference on Artificial Intelligence and Interactive Digital Entertainment, 11(1):223-225, 2015. URL https: //ojs.aaai.org/index.php/AIIDE/article/view/12776.
 Ian Millington. AI for games. Taylor & Francis, a CRC title, Boca Raton, third edition edition. 2019. ISBN 978-1-138-48397-2.

- Stuart J. Russell and Peter Norvig. Artificial intelligence: a modern approach. Pearson series in artificial intelligence. Pearson, Hoboken, fourth edition edition, 2021. ISBN 978-0-13-461099-3.
- Andrey Simonov, Aleksandr S. Zagarskikh, and Victor Fedorov. Applying behavior characteristics to decision-making process to create believable game ai. *Procedia Computer Science*, 2019.
- Allen Van Gelder, Kenneth A. Ross, and John S. Schlipf. The well-founded semantics for general logic programs. *Journal of the ACM*, 38(3):619–649, July 1991. ISSN 0004-5411, 1557-735X. doi: 10.1145/116825.116838. URL https://dl.acm.org/doi/10.1145/116825.116838.
 David S. Warren. Programming in tabled prolog, 1999.

Georgios N. Yannakakis and Julian Togelius. Artificial Intelligence and Games. Springer International Publishing : Imprint: Springer, Cham, 1st ed. 2018 edition, 2018. ISBN 978-3-319-63519-4. doi: 10.1007/978-3-319-63519-4.