# BDI multi-agent modelling of the population's decision making in a bushfire

Geoffrey DANET
M2 MoSIG
supervised by Carole ADAM
LIG - MAGMA team

22<sup>nd</sup> June 2016







## Black Saturday

- 7 February 2009,
- 173 dead et 414 injured,
- $\sim$  450 000 ha burned.
- The expected behaviour is different from the reality,

### SWIFT project:

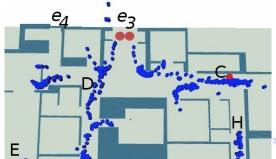
- ightarrow Make a serious game in order to raise the awareness of the emergency managers about the real population behaviour.
- $\rightarrow$  Simulation must be as realistic as possible.



## Computer simulation

## Why computer simulation?

- Repeatable,
- Controllable,
- Cheap,
- Safe.



## Table of Contents

- State Of the Art

## State Of the Art

The existing simulations are focused on:

- Fire behaviour [Duff et al., 2013],
- The crowd behaviour during building and public area evacuation

[Kuligowski, 2008, Pan et al., 2006, Pelechano et al., 2005],

- Basic and homogeneous behaviour,
- Lack of human factors (emotions, determination, ...),
- Ignores pre-evacuation.
- → Simulation based on a cognitive architecture.

## State Of the Art (2)

Simulations using a cognitive architecture exist but:

- Evacuation in public area
  - $\rightarrow$  behaviours are different in a personal house [Tsai et al., 2011],
- Focus on performance and scalability
  - $\rightarrow$  homogeneous behaviour without personality [Cho et al., 2008].
- → Use a top-down approach (from the theory to the implementation).

## Proposal

- Make a realistic simulation of Autralian population behaviour in bushfires.
- → Require valid results,
- $\rightarrow$  Use of cognitive architecture.

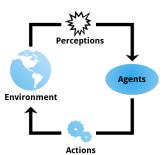


## Simulation Multi-Agent

### What is an agent?

Autonomous system which perceives and interacts with its environment.

- Multiple agents coexist and interact.
- Different agent architectures of varying complexity.



### Belief Desire Intention

#### Beliefs

Information about the environment, itself or the other agents. It can be **incomplete** or **incorrect**.

#### **Desires**

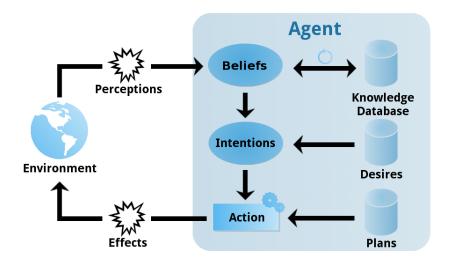
Motivations to do something. It can be **inconsistent** or **unrealistic**.

#### Intentions

Leads to action.

Selected from the **desires** and **beliefs** of the agent. It can have several associated **plans** allowing to achieve it.

## Believe Desire Intention (2)



### Table of Contents

- State Of the Art
- 2 Data and Tools
- 3 Implementation
- Experiments and results
- Conclusion

#### Sue Exell

"I **looked** out the window and **saw** some hazy smoke to the north-west ..."

 $\rightarrow$  Perception

#### Sue Exell

"... Gary said that he **thought** it was just dust but we went outside ..."

→ Belief

## Sue Exell

"... and straight away we **noticed** that we could **smell** smoke ..."

- → Perception
- → New belief (updated)

#### Sue Exell

"... as soon as that happened, Gary agreed to **go and get** the fire pump. ..."

- → Intention : defend their property,
- → First plan : Prepare the fire pump.

## Tactics Decision Framework (TDF)

TDF is a tactical decision-making modelling tool based on the Prometheus methodology [Evertsz et al., 2015]. It provides:

- BDI Based paradigm,
- Structural modelling of missions, goals, scenarios, input/output, messaging and procedures.

# Tactics Decision Framework (TDF) (2)

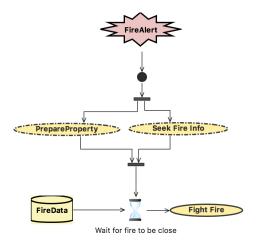


Figure: Plan diagram example

## **GAMA** and **GAML**

- Open source development platform
- GAML language
- BDI extension

```
Perception exemple

perceive target:fire in:perception_radius {
  add self to: myself.known_fires;
  ask myself {
    do add_belief(fire);
  }
}
```

## Civilian's Profiles

A previous study by Alan Rhodes shows there are 6 existing profiles [Rhodes, 2014]:

- Can do defender: "Just do it, just get on with it"
- Considered defender: "You have to be prepared if you choose to live here"
- Livelihood defender: "It's not just a house, it's our livelihood"
- Threat monitor: "I'll leave when I need to before it's really dangerous"
- Threat avoider: "Life is more important than the house"
- Unaware reactor: "I didn't expect a fire like that I was shocked"

## Table of Contents

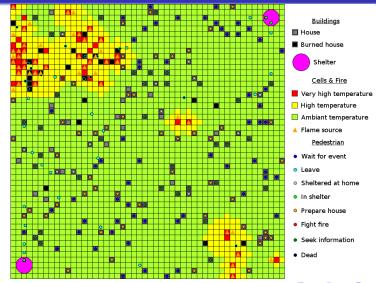
- State Of the Art
- Data and Tools
- 3 Implementation
- 4 Experiments and results
- Conclusion

## **Implementation**

BDI architecture based on a Finite State Machine (FSM) made in a previous study [Adam et al., 2015] and on the witness statements data [VBRC, 2009c].

- Grid which represents the map,
- 200 "Pedestrian" BDI agents (Australian citizens),
- 200 houses (one per Pedestrian agent),
- 2 shelters,
- Basic fire implementation (random propagation).

## Graphical rendering



## Demo

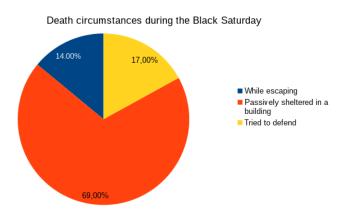
## Table of Contents

- State Of the Art
- Data and Tools
- 3 Implementation
- 4 Experiments and results
- Conclusion

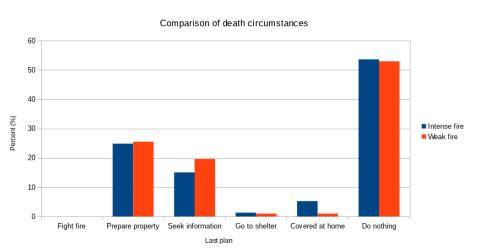
## Experiments

- 2 different parameters sets,
  - Weak fire: low intensity and low propagation rate,
  - Intense fire: high intensity and high propagation rate.
- Each experiment includes 500 cycles and 10 simulation iterations,
- The results will be compared between them and with the statistics from the Victorian Bushfires Royal Commission [VBRC, 2009a],

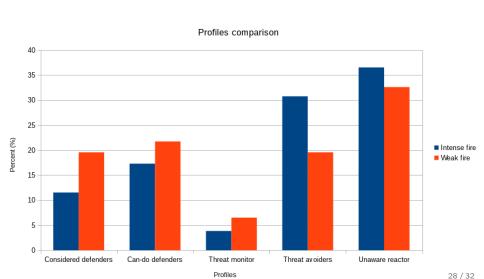
#### **Statistics**



## Result: death circumstances



## Result: profiles



### Table of Contents

- State Of the Art
- 2 Data and Tools
- 3 Implementation
- 4 Experiments and results
- Conclusion

### Contribution

- Followed a bottom-up methodology: Interviews  $\rightarrow$  TDF  $\rightarrow$  GAMA.
- implemented a realistic BDI model,
- Studied model validity,
- Provided feedback on GAMA and TDF,
- Submitted paper to ISCRAM-med 2016 (under review).

#### Future Work

- Compare BDI vs Finite State Machine (FSM),
- Improve the BDI implementation (add emotions, social relationships...),
- Integrate a more realistic fire model (SPARK [Miller et al., 2015]),
- Take into account the topology (road, forest...)
- Subject of a PhD Thesis.

# BDI multi-agent modelling of the population's decision making in a bushfire

Questions are welcome.





Adam, C., Beck, E., and Dugdale, J. (2015).

Information Systems for Crisis Response and Management in Mediterranean Countries: Second International Conference, ISCRAM-med 2015, Tunis, Tunisia, October 28-30, 2015, Proceedings, chapter Modelling the Tactical Behaviour of the Australian Population in a Bushfire, pages 53–64.

Springer International Publishing.



Cho, K., Iketani, N., Kikuchi, M., Nishimura, K., Hayashi, H., and Hattori, M. (2008).

BDI Model-Based Crowd Simulation, pages 364–371. Springer Berlin Heidelberg, Berlin, Heidelberg.



Duff, T. J., Chong, D. M., and Tolhurst, K. G. (2013).

Quantifying spatio-temporal differences between fire shapes: Estimating fire travel paths for the improvement of dynamic spread models.

Environmental Modelling and Software, 46:33–43.



Evertsz, R., Thangarajah, J., Yadav, N., and Ly, T. (2015).

 BDI multi-agent modelling of the population's decision making in a bushfire Conclusion

Journal of Systems and Software, 110:222–238.



Kuligowski, E. D. (2008).

Modeling human behavior during building fires.

Technical report, National Institute of Standards and Technology.



Miller, C., Hilton, J., Sullivan, A., and Prakash, M. (2015). SPARK – A Bushfire Spread Prediction Tool, pages 262–271.

Springer International Publishing, Cham.



Pan, X., Han, C. S., Dauber, K., and Law, K. H. (2006).

Human and social behavior in computational modeling and analysis of egress.

Automation in Construction, 15(4):448-461.

The first conference on the Future of the {AEC} Industry (BFC05).



Pelechano, N., O'Brien, K., Silverman, B., and Badler, N. (2005).

Crowd simulation incorporating agent psychological models, roles and communication.

Technical report, Center for Human Modeling and Simulation University of Pennsylvania, 200 S. 33rd St. Philadelphia, PA=19104-6389 USA:



Rhodes, A. (2014).

Why don't they do what we think they should? In *AFAC*. Emergency Management Victoria.



Tsai, J., Fridman, N., Brown, M., Ogden, A., Rika, I., Wang, X., Epstein, S., Zilka, A., Taylor, M., Tambe, M., Bowring, E., Marsella, S., Kaminka, G. A., and Sheel, A. (2011).

Escapes - evacuation simulation with children, authorities, parents, emotions, and social comparison.



VBRC (2009a).

The lessons learnt.

http://www.royalcommission.vic.gov.au/Finaldocuments/volume-1/PF/VBRC\_Vol1\_Chapter21\_PF.pdf.



VBRC (2009b).

Witness statement.

http:

//vol4.royalcommission.vic.gov.au/index03a1.html?pid=111.



VBRC (2009c).

BDI multi-agent modelling of the population's decision making in a bushfire Conclusion

#### Witness statement.

http:

//vol4.royalcommission.vic.gov.au/index82b9.html?pid=136.