



Using Action Abstraction to Evolve Effective Controllers

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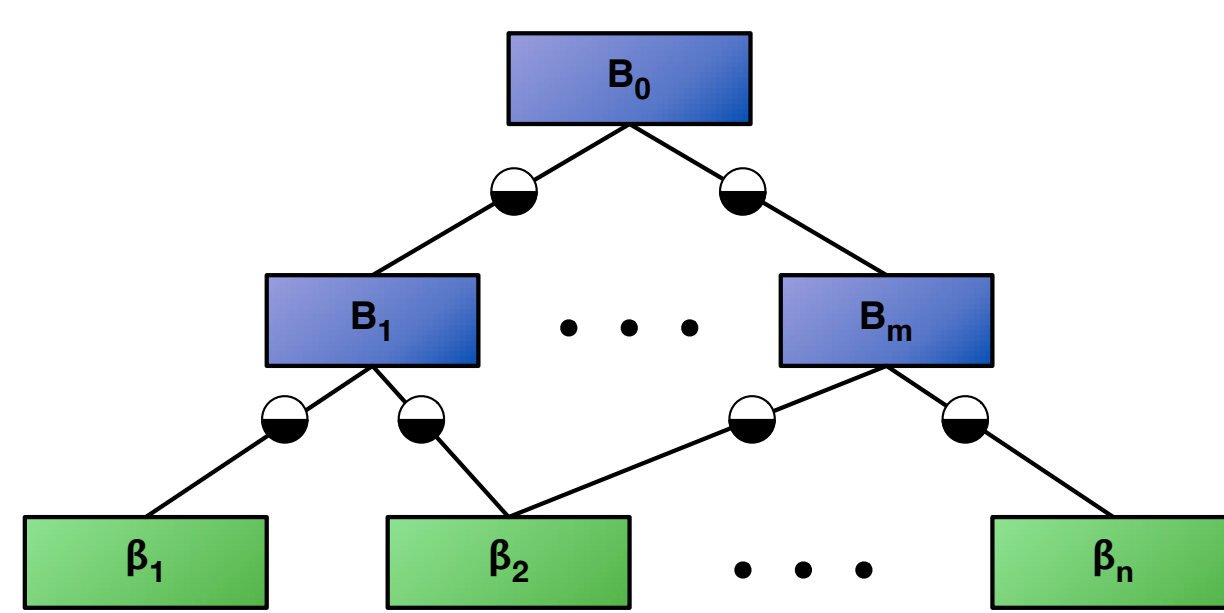
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Introduction

- ▶ Development of controller for a simple task is straightforward, but
- ▶ Becomes impractical with more tasks added
- ▶ Naïve approach is to develop **monolithic** controller
- ▶ Doesn't scale well!
- ▶ Need an approach to make development of complex controllers more practical

Fuzzy Behavior Hierarchies

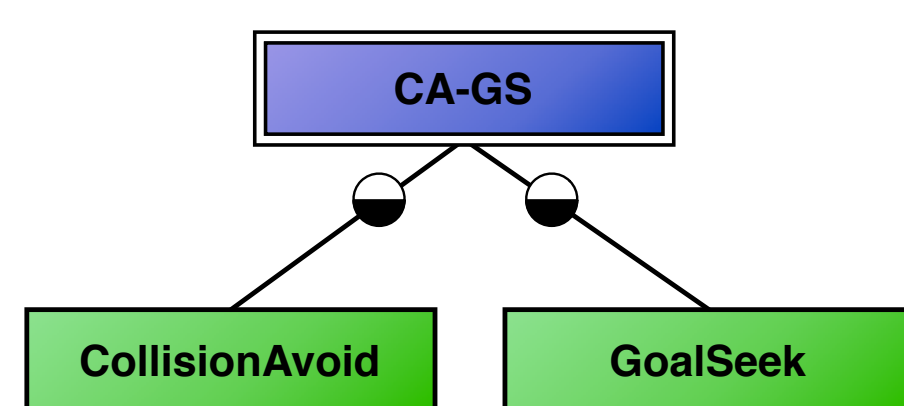


Generic hierarchical decomposition of behavior

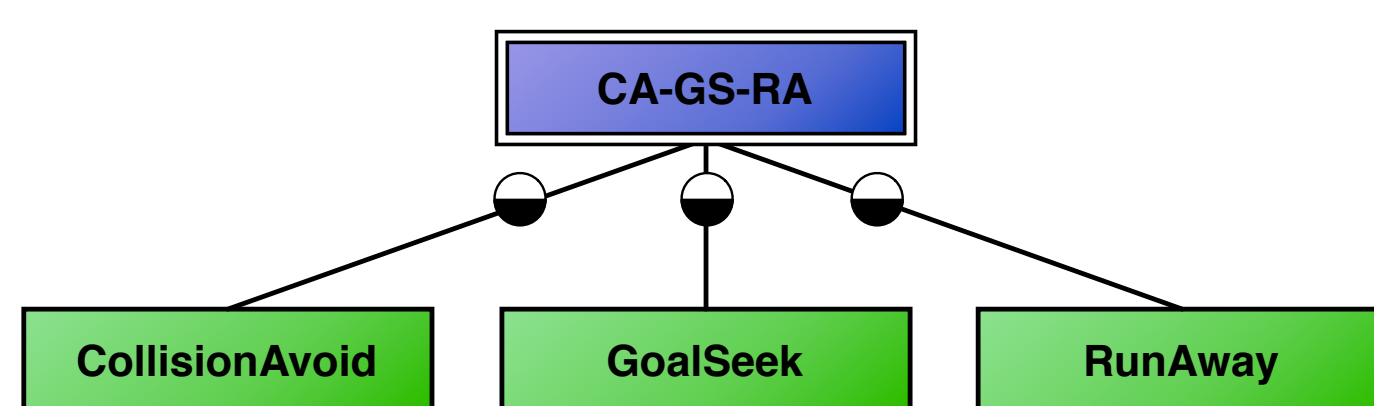
- ▶ Developed by Tunstel
- ▶ Keeps simple tasks separate
- ▶ Uses a hierarchy of controllers
- ▶ Single controller for each simple task
- ▶ High-level controllers to coordinate
- ▶ Implemented used fuzzy rule sets
- ▶ **Coordination uses action abstraction**
- ▶ Allows for the use of state abstraction also

Navigation Problem

- ▶ Used two conceptually simple navigation tasks
- ▶ Examples of relatively simple composite tasks



CA-GS task: Navigate to goal while avoiding obstacles



CA-GS-RA task: Navigate to goal while avoiding obstacles and steering clear of hazards

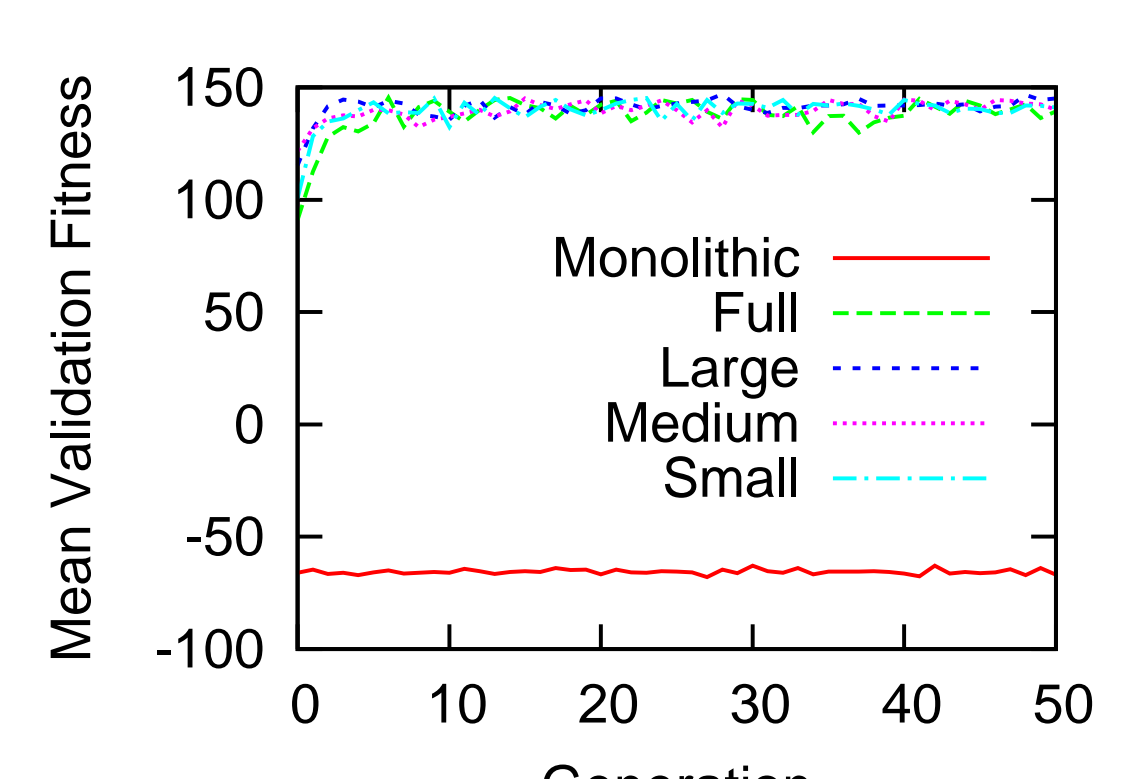
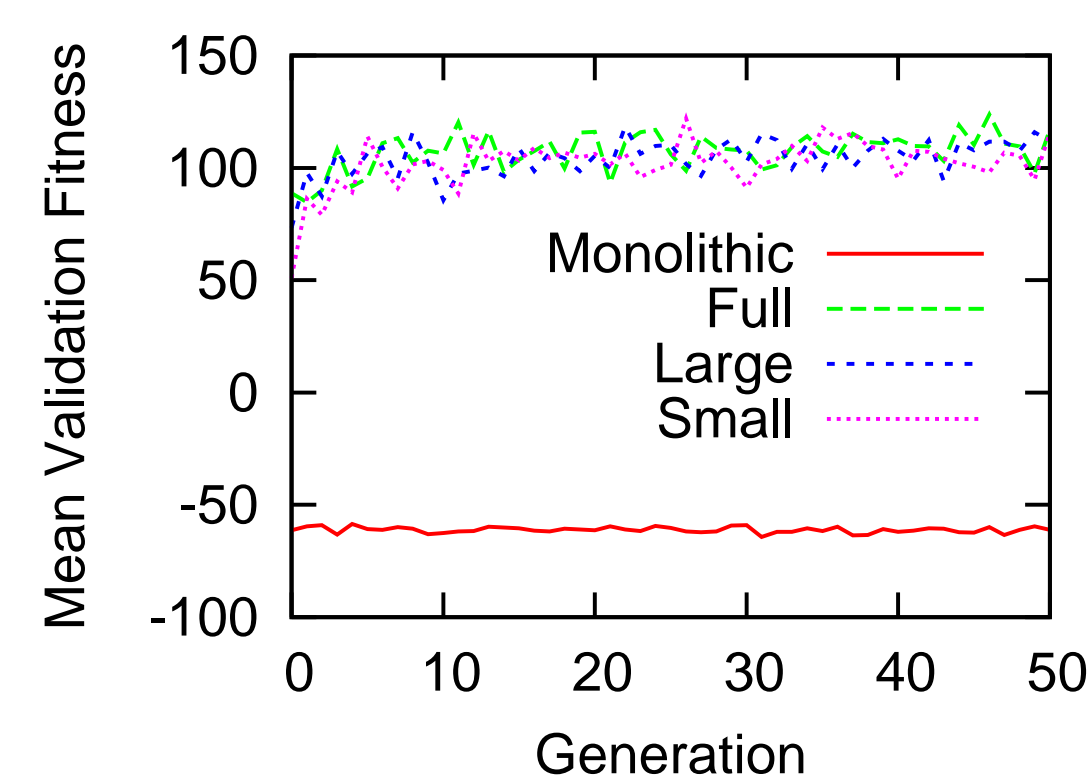
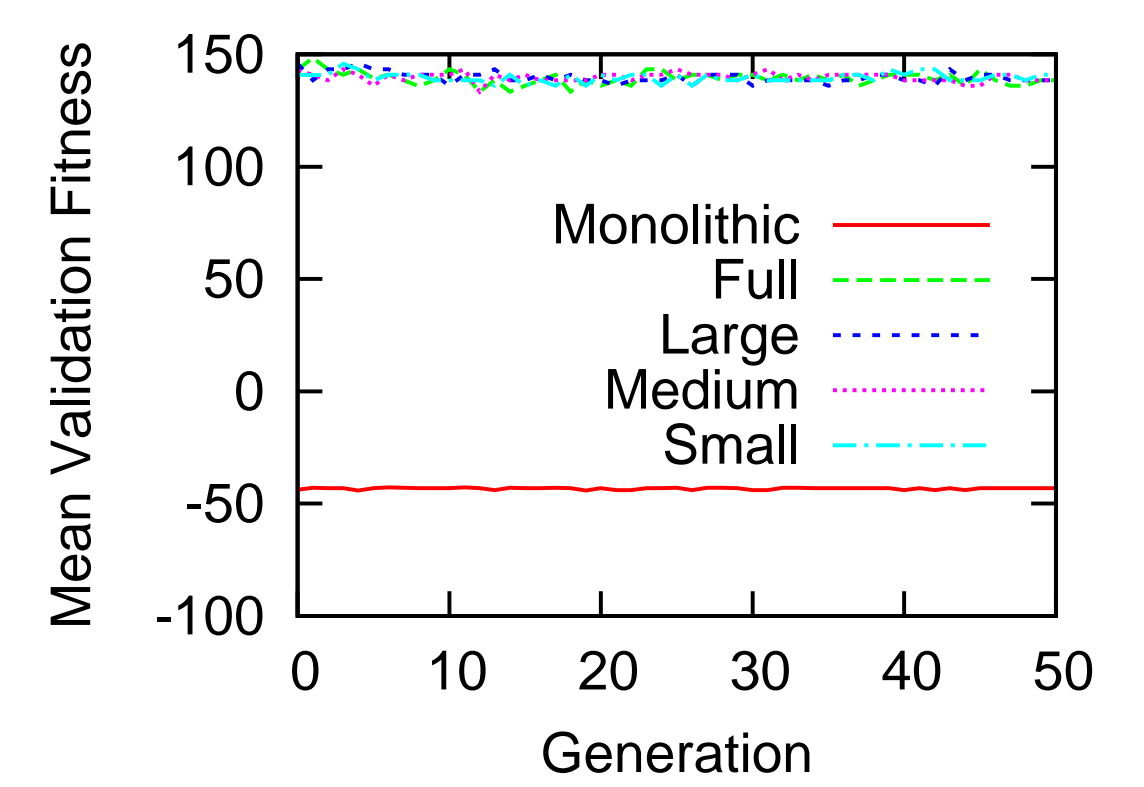
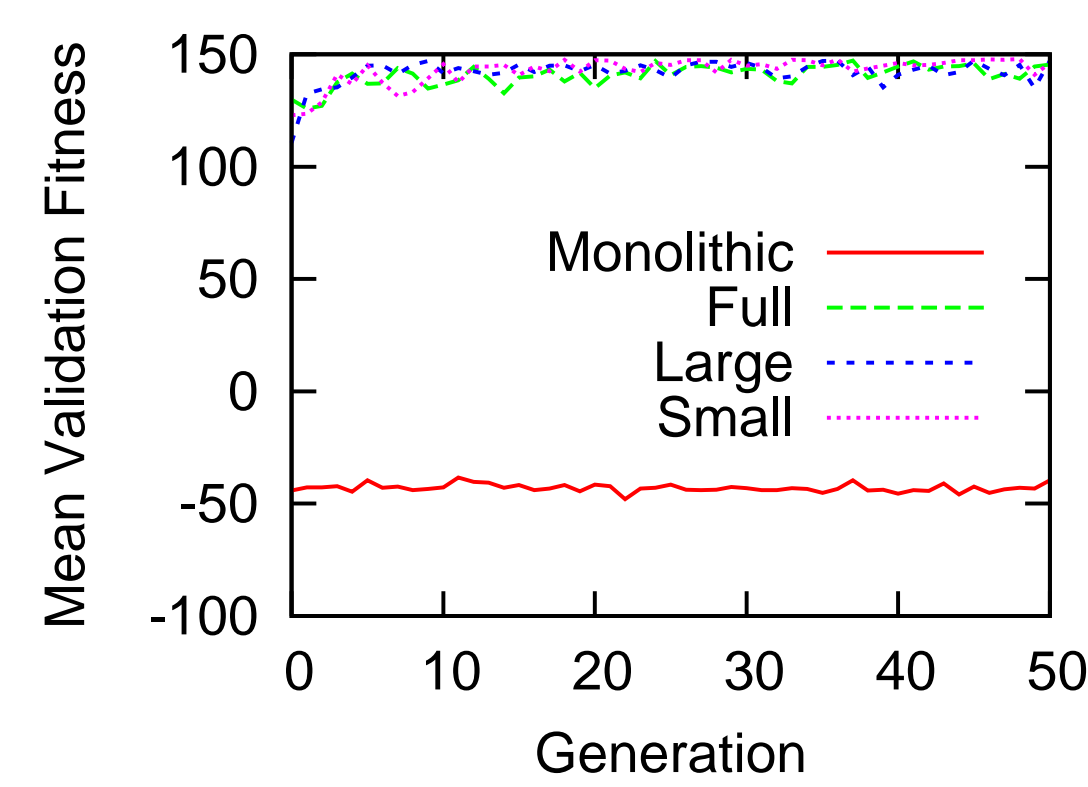
Evolving Fuzzy Rulesets

- ▶ Tunstel originally used genetic programming
- ▶ Ensuring valid fuzzy rules is computationally expensive
- ▶ Used grammatical evolution instead
- ▶ Only valid rules are generated by grammar

Experiments

- ▶ Environments were unbounded and continuous
- ▶ 2-D and 3-D environments were used
- ▶ Tested effects of 4 levels of state abstraction on performance
- ▶ Used existing controllers for simple tasks
- ▶ Evolved coordination controller only

Results



Discussion

- ▶ State-action space for monolithic CA-GS-RA controller is smaller than hierarchical, but
- ▶ Effective hierarchical controllers were evolved quickly
- ▶ Could not evolve effective monolithic controllers
- ▶ Success due to abstract action-space of hierarchical controllers
- ▶ No performance difference in state abstraction levels
- ▶ Results don't reflect effort to develop controllers for simple tasks
- ▶ Can develop those with minimal effort

Conclusions

- ▶ Action abstraction was fundamental to success
- ▶ Could not evolve effective monolithic controllers
- ▶ Hierarchical controllers were evolved quickly
- ▶ Existing controllers for simple tasks were reused
- ▶ Development of more complex controllers can be more practical