# Discovering Options for Exploration by Minimizing Cover Time

Yuu Jinnai, Jee Won Park, David Abel, George Konidaris
Brown University

Poster at Ballroom #117

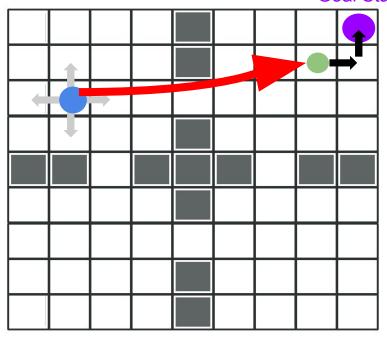
# Options (Sutton et al. 1999)

#### **Primitive Actions**

# **Goal State**

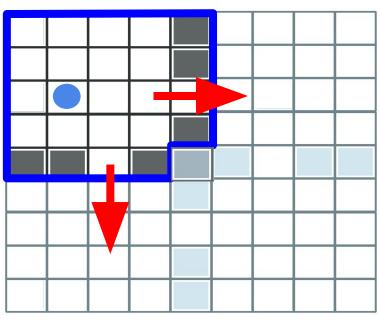
### **Using Options**

**Goal State** 

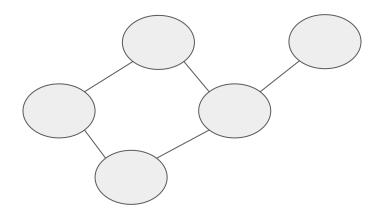


# How can options help agents explore?

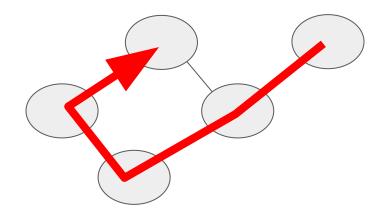




1. Introduced an objective function for exploration: cover time



1. Introduced an objective function for exploration: cover time

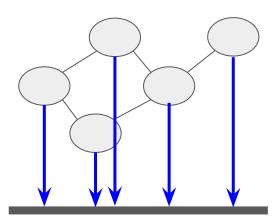


Cover Time: #steps to visit every state by a random walk

- 1. Introduced an objective function for exploration: cover time
- 2. Proposed **an option discovery algorithm** which minimizes the upper bound of the cover time

#### **Algorithm:**

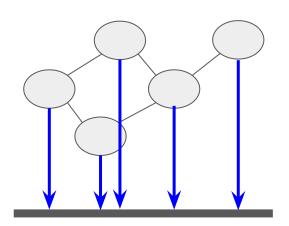
1. Embed the state-space graph to a real value (i.e. Fiedler vector)

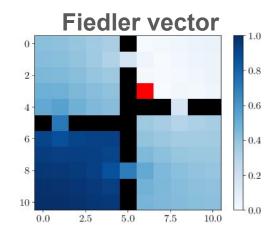


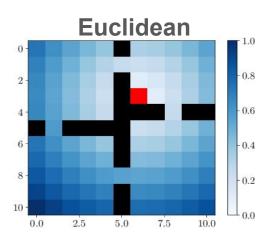
- 1. Introduced an objective function for exploration: cover time
- 2. Proposed **an option discovery algorithm** which minimizes the upper bound on the cover time

#### **Algorithm:**

1. Embed the state-space graph to a real value (i.e. Fiedler vector)



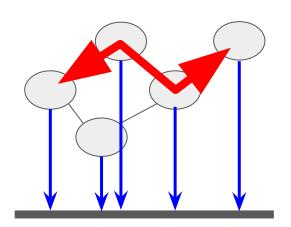


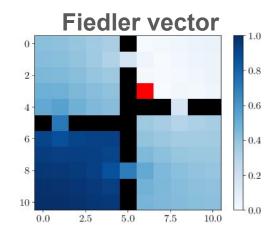


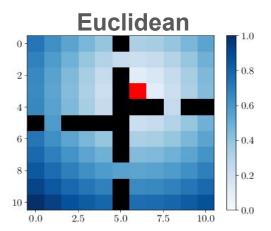
- 1. Introduced an objective function for exploration: cover time
- 2. Proposed **an option discovery algorithm** which minimizes the upper bound on the cover time

#### **Algorithm:**

- 1. Embed the state-space graph to a real value (i.e. Fiedler vector)
- 2. Generate options to connect the two most distant states



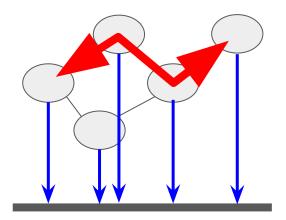




- 1. Introduced an objective function for exploration: cover time
- Proposed an option discovery algorithm which minimizes the upper bound on the cover time

#### **Algorithm:**

- 1. Embed the state-space graph to a real value (i.e. Fiedler vector)
- 2. Generate options to connect the two most distant states

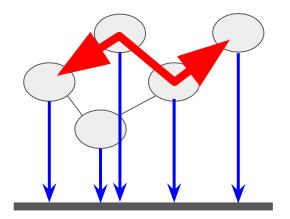


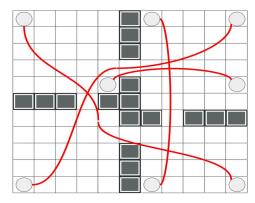
#### Theorem:

The upper bound on the cover time C(G') is improved:

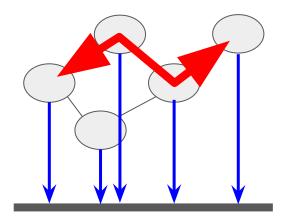
$$\mathbb{E}[C(G')] \le \frac{n^2 \ln n}{\lambda_2(\mathcal{L}) + F} (1 + o(1))$$

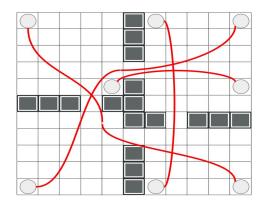
- 1. Introduced an objective function for exploration: cover time
- 2. Proposed **an option discovery algorithm** which minimizes the upper bound on the cover time
- 3. **Empirical comparison** shows that it outperforms existing algorithms

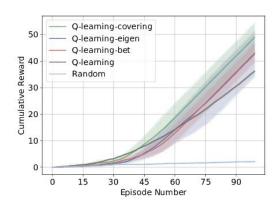




- 1. Introduced an objective function for exploration: cover time
- 2. Proposed **an option discovery algorithm** which minimizes the upper bound on the cover time
- 3. **Empirical comparison** shows that it outperforms existing algorithms







- 1. Introduced an objective function for exploration: cover time
- 2. Proposed **an option discovery algorithm** which minimizes the upper bound on the cover time
- 3. **Empirical comparison** shows that it outperforms existing algorithms

#### Poster at Ballroom #117

