

# Improving Efficiency of Leading a Flock in Ad Hoc Teamwork Settings

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# Outline

**1** Introduction

2 Problem Definition

3 Search Methodology

4 Effect of Non-stationary Ad Hoc Agents

5 Plan Repair Methods

6 Summary

# Ad Hoc Teamwork

Always:

- ▶ Only in control of a single agent or subset of agents
- ▶ Shared goals
- ▶ No pre-coordination

Sometimes:

- ▶ Unknown teammates
- ▶ No explicit communication



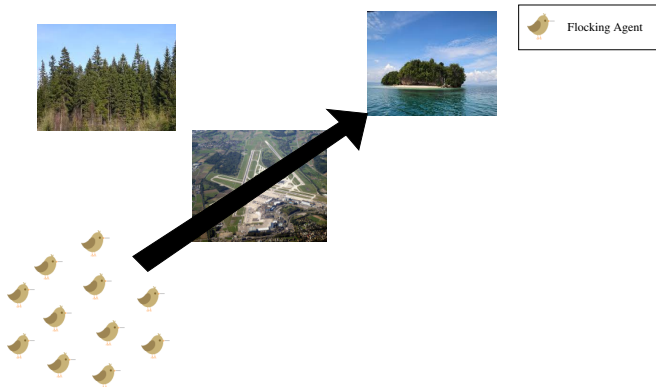
# Flocking

- ▶ Emergent behavior found in nature
  - ▶ Birds, fish, insects
- ▶ Animals follow a simple local behavior rule
- ▶ Group behavior is cohesive

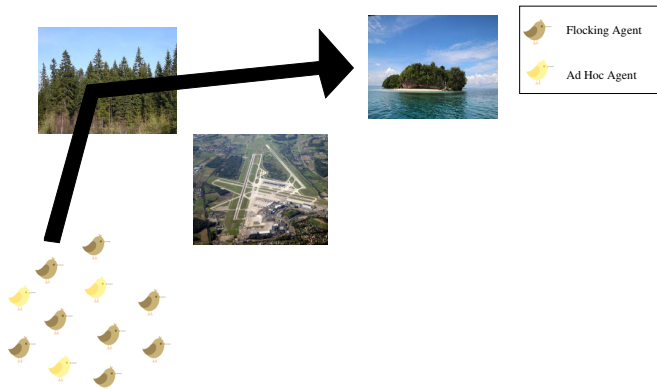




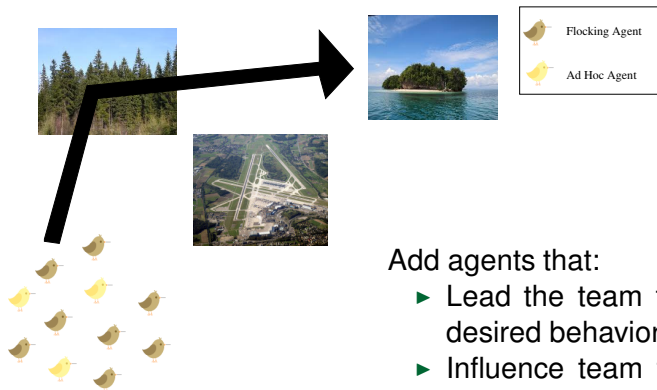
# Example — Leading Teammates in Ad Hoc Settings



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# Example — Leading Teammates in Ad Hoc Settings



Add agents that:

- ▶ Lead the team to adopt desired behaviors
- ▶ Influence team to maximize team utility

# Flocking + Ad Hoc Teamwork

Why is this an ad hoc teamwork problem?

- ▶ No explicit control of flocking agents
- ▶ All agents have shared goals (maximize team utility)
- ▶ On-the-fly coordination

# Flocking + Ad Hoc Teamwork

In previous work (Jadbabaie et al. 2003, Su et al. 2009), the flock eventually converges to a single controllable agent's heading.

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## **Research Problem:**

Is it possible for one or more agents to lead the team to a desired orientation, and if so - what is the most efficient way of doing so?

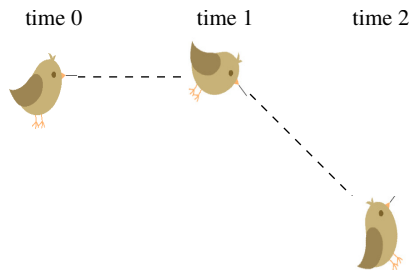
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# Problem Definition

Each agent has:

- ▶ Constant velocity
- ▶ 2D Position
- ▶ Global orientation

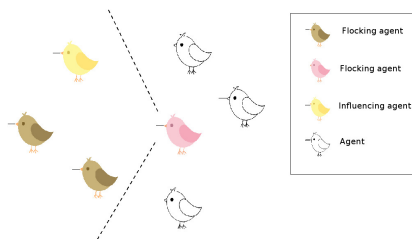




# Problem Definition - Neighborhood

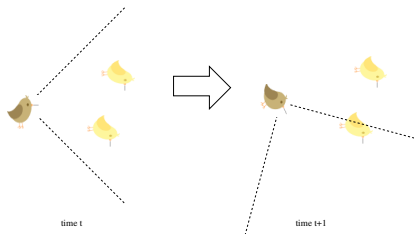
Each flocking agent reacts only to agents within a certain *neighborhood* around itself.

- ▶ Characterized by a *visibility cone*



# Problem Definition - Orientation Update

A flocking agent's orientation at the next time step is set to be the *average global orientation* of all agents currently within the agent's visibility cone.



# Problem Definition

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# Outline

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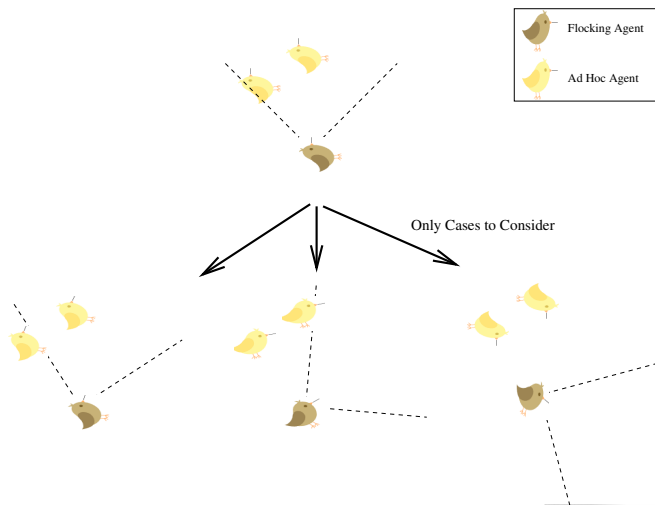
**3 Search Methodology**

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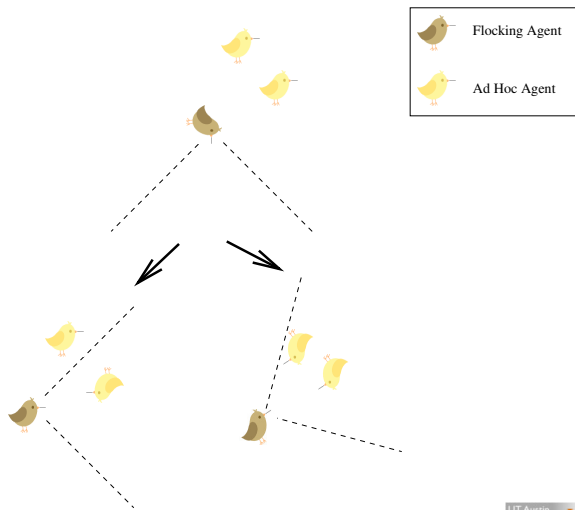
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# Forward Search Planning Method (AAMAS'13)



# Backward Search Planning Method



# Comparison of Forward and Backward Search Methods

- ▶ Forward Search
  - ▶ Planning for moving ad hoc agents is easier and more intuitive
  - ▶ Less efficient ( $2^{\text{numAdHoc}} * \text{numAdHoc} + 1 * \text{maxSteps}$ )
- ▶ Backward Search
  - ▶ Planning for moving ad hoc agents is more difficult
  - ▶ More efficient ( $\text{maxSteps} * 2\text{numAdHoc}^2$ ) due to better pruning

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# Motion Can Be Helpful

Non-stationary ad hoc agents can influence the flocking agents to reach  $\theta^*$  faster than stationary ad hoc agents.

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# Motion Can Be Harmful

Non-stationary ad hoc agents can influence the flocking agents to reach  $\theta^*$  slower than stationary ad hoc agents.

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# Outline

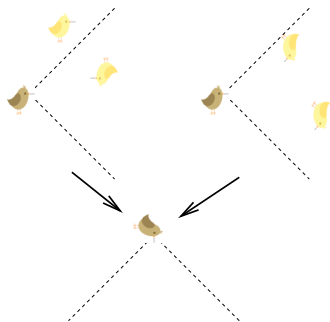
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# Overview

- ▶ Altering Ad Hoc Agent Behavior
- ▶ Replanning Ad Hoc Agent Behavior
  - ▶ Move Inside Visibility Cone
  - ▶ Move Border Closer to  $\theta^*$

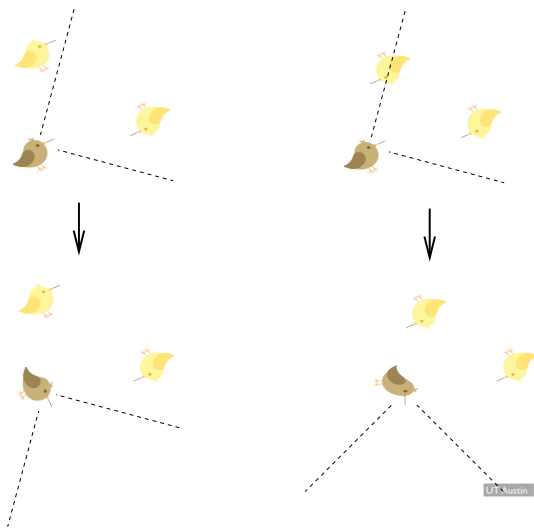
# Altering Ad Hoc Agent Behavior

- ▶ Keeps the same desired sequence of orientations for the flocking agents
- ▶ Recalculates ad hoc orientations
- ▶ May not be possible in some situations



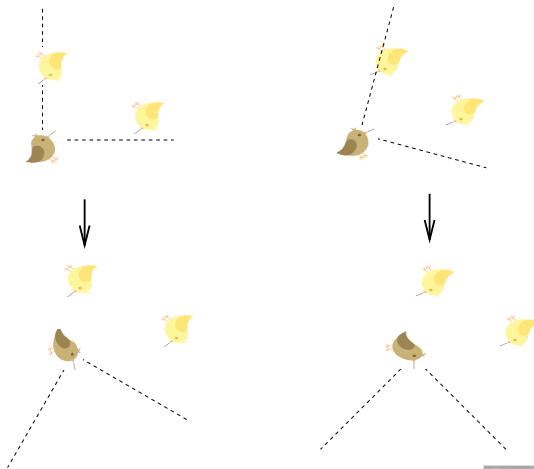
# Replanning Ad Hoc Agent Behavior

## Move Inside Visibility Cone



# Replanning Ad Hoc Agent Behavior

Move Border Closer to  $\theta^*$



# Conjecture

Running the plan repair methods on all the minimal size plans returned by the search will obtain an optimal plan for moving ad hoc agents.

- ▶ Must all minimal size plans be repaired?
- ▶ Can just one minimal size plan be repaired?
- ▶ Or must all plans be repaired?



## Related Work — Ad Hoc Teamwork

- ▶ Jones et al. 2006
  - ▶ Empirically studied dynamically formed heterogeneous multi-agent teams
  - ▶ All agents know they are working as a team
- ▶ Agmon and Stone 2012, Stone et al. 2010
  - ▶ Leading teammates in ad hoc settings from a game theoretic approach
- ▶ Stone et al. 2010
  - ▶ Introduced the ad hoc teamwork problem

## Related Work — Flocking

- ▶ Han et al. 2006
  - ▶ Studied how one agent can influence the direction in which a flock of agents is moving
  - ▶ Utilized one ad hoc agent with unlimited, non-constant velocity
- ▶ Reynolds 1987, Vicsek 1995
  - ▶ Concerned with simulating flock behavior
  - ▶ Not concerned not with adding controllable agents to the flock
- ▶ Jadbabaie et al. 2003, Su et al. 2009
  - ▶ Used controllable agents to influence the flock
  - ▶ Only concerned with making the flock converge to some orientation eventually

# Future Work

- ▶ Optimal behavior for non-stationary ad hoc agents
  - ▶ Repair one minimal plan?
  - ▶ Repair all minimal plans?
  - ▶ Repair all plans?
  
- ▶ General case of non-stationary agents

# Summary

## Research Problem:

Is it possible for one or more agents to lead the team to a desired orientation, and if so - what is the most efficient way of doing so?

