

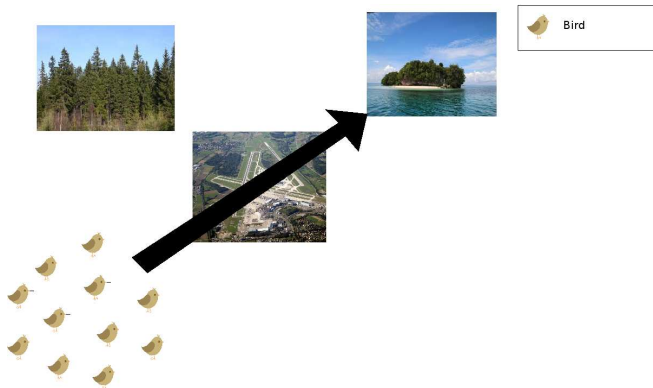
# Adding Influencing Agents to a Flock

Katie Genter and Peter Stone

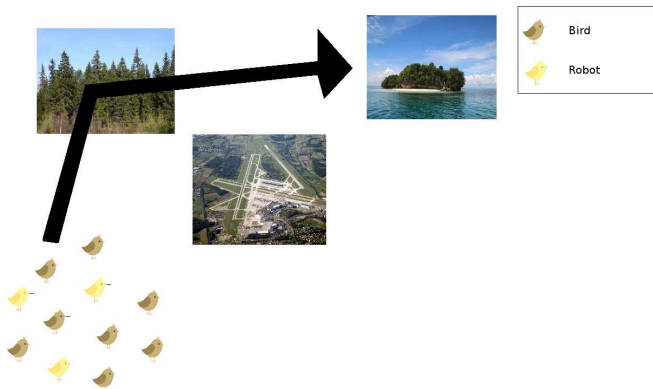
The University of Texas at Austin  
{katie,pstone}@cs.utexas.edu

May 11, 2016

# Motivating Example



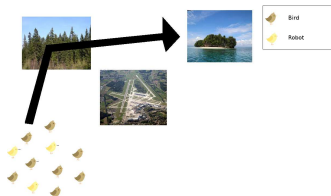
# Motivating Example



# Ad Hoc Teamwork

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

**Scientific question:** How to design an agent to **productively join** a pre-existing team while requiring **no pre-coordination**?



# Flocking

- ▶ **Emergent** behavior found in nature
  - ▶ Birds, fish, insects
- ▶ Simple local behaviors & interactions
- ▶ Group behavior appears well organized and stable



# Research Question

## **Research Question:**

How can robots be utilized in various types of flocks in order to influence these flocks towards a particular behavior?

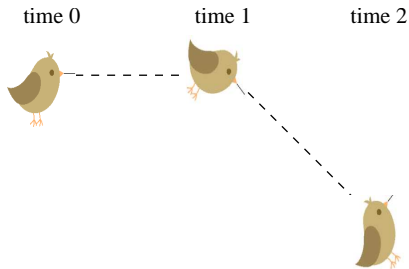
# Outline

- 1 Introduction
- 2 Problem Definition**
- 3 Existing Placement Methods
- 4 Improved Placement Methods
- 5 Behavior as Flock Arrives
- 6 Summary

# Problem Definition

Both robots and birds have:

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

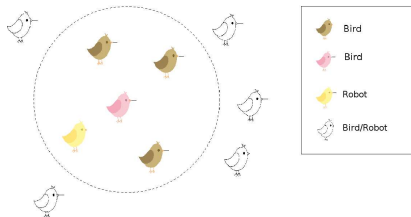




# Problem Definition - Neighborhood

Each bird reacts only to birds and robots within a certain **neighborhood** around itself.

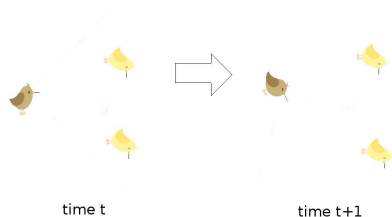
- ▶ Characterized by a **sphere of influence** in this work



# Problem Definition - Orientation Update

A birds' orientation at the next time step is set to be the **average global orientation** of all birds and robots currently within the bird's neighborhood.

- ▶ Birds follow a simplified Reynolds flocking model



# Problem Definition - Performance Metrics

Two metrics used in this work:

- ▶ Number of birds 'lost'
- ▶ Number of trials in which any birds are 'lost'

# Research Question

Previously we considered how robots should behave and where they should be located within a flock in order to best influence the flock (Genter and Stone, ANTS 2014 & Genter, Zhang and Stone, AAMAS 2015).

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Given computational limitations, how should robots be placed within a flock?

How should robots join a flock in motion if they are able to arrive ahead of the flock?

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# Existing Placement Methods

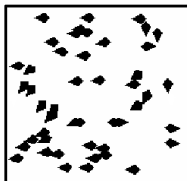
Initial position “dropped into the flock”

- ▶ Random Placement
- ▶ Grid Placement
- ▶ Border Approach
- ▶ Graph Approach



# Existing Placement Methods

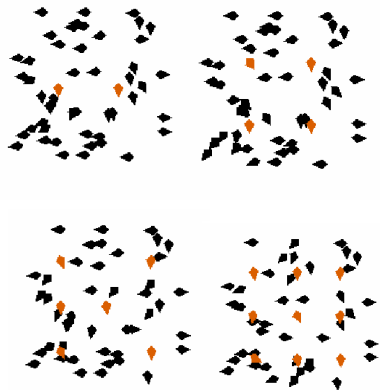
- ▶ Random Placement
  - ▶ Randomly place robots within the square in which birds might exist.
- ▶ Grid Placement
- ▶ Border Approach
- ▶ Graph Approach





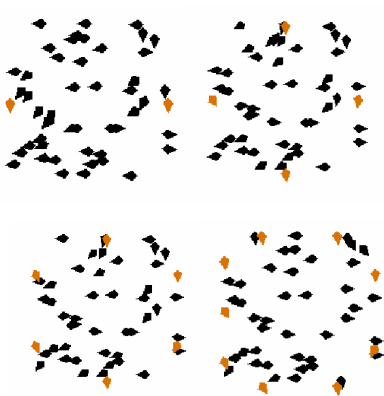
# Grid Placement

Place **robots** at predefined, well-spaced, gridded positions throughout the square in which birds might exist.



# Border Approach

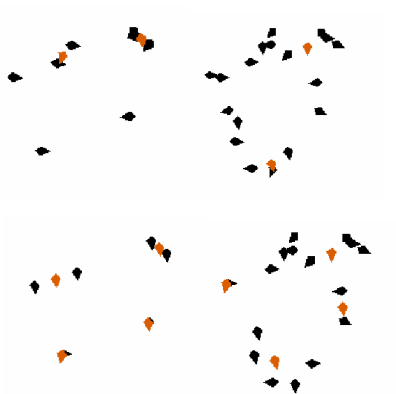
Place robots as evenly as possible around the square in which birds might exist.



# Graph Approach

Consider many possible sets of positions in which the **robots** could be placed, and then evaluate how well each of these sets connects the birds with the robots.

Complexity of placing robots:  
 $O((\text{robots} + \text{birds})^3 \binom{\text{birds}^2 + \text{birds}}{\text{robots}})$

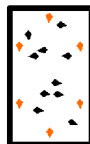
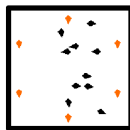
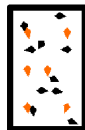
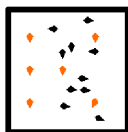


# Outline

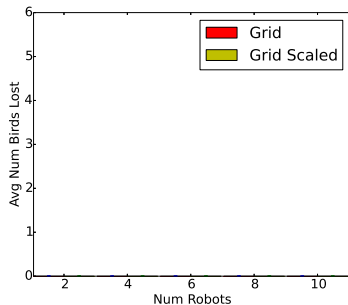
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  - Scaled Placement Method
  - Hybrid Placement Method
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# Scaled Placement

Fit the placement area for robots as a rectangle around the actual area covered by the flock.

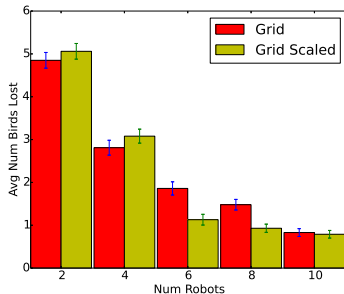


# Scaled Placement Experimental Results



The average number of birds lost when the flock contained 10 birds and 2-10 robots. These results are obtained over 100 runs. Error bars show the standard error of the mean.

# Scaled Placement Experimental Results



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# Hybrid Placement

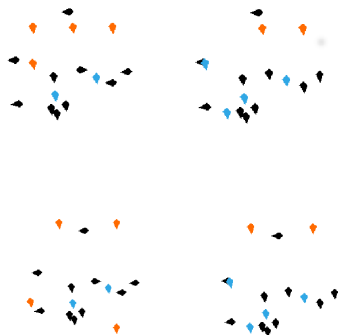
Use the **Graph placement method** to choose the first  $k_g$  robot placements. Then select the remaining  $k - k_g$  placements using a **constant time placement method**.

Complexity of Graph placement:

$$O((\text{robots} + \text{birds})^3 \binom{\text{birds}^2 + \text{birds}}{\text{robots}})$$

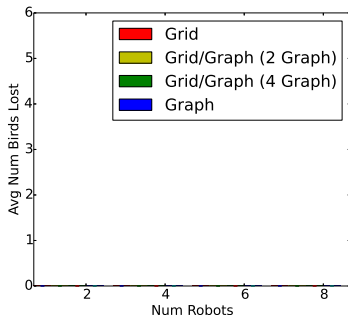
Complexity of Hybrid placement:

$$O((\text{robots} + \text{birds})^3 \binom{\text{birds}^2 + \text{birds}}{k_g})$$



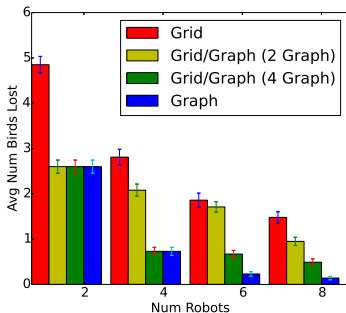


# Hybrid Placement Experimental Results



The average number of birds lost when the flock contained 10 birds and 2-8 robots. These results are obtained over 100 runs. Error bars show the standard error of the mean.

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# Behavior as Flock Arrives

So far, we have assumed robots can be **placed** into a flock.  
Now, we begin to consider **joining** a flock.

# Behavior as Flock Arrives

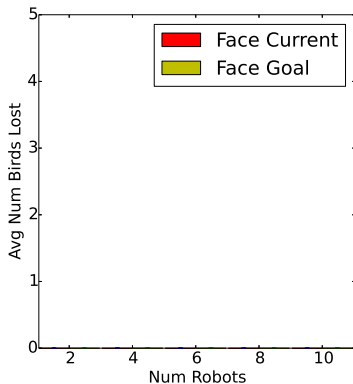
So far, we have assumed robots can be **placed** into a flock.  
Now, we begin to consider **joining** a flock.

If robots are able to position themselves **ahead** of an approaching flock, how should these robots behave as the flock approaches?

- ▶ Face Current
- ▶ Face Goal

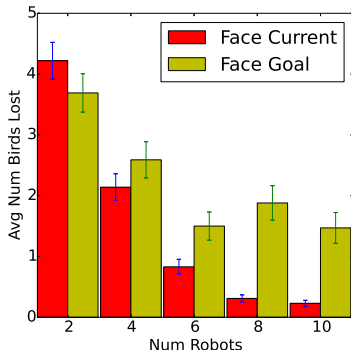


# Arrival Behavior Experimental Results



The average number of birds lost using the border placement approach when the flock contained 10 birds and 2-10 robots. These results are obtained over 100 runs. Error bars show the standard error of the mean.

# Arrival Behavior Experimental Results



The average number of birds lost using the border placement approach when the flock contained 10 birds and 2-10 robots. These results are obtained over 100 runs. Error bars show the standard error of the mean.

## Related Work — Ad Hoc Teamwork

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



## Related Work — Flocking (1)

- ▶ Reynolds 1987, Vicsek et al. 1995
  - ▶ Concerned with simulating flock behavior
  - ▶ Not concerned with adding controllable agents to the flock
- ▶ Turgut et al. 2008
  - ▶ Considered the behavioral effects of providing different information to the flock
- ▶ Jadbabaie et al. 2003, Su et al. 2009, Celikkanat and Sahin 2010
  - ▶ Used controllable agents to influence the flock
  - ▶ Only concerned with making the flock converge to some heading eventually

## Related Work — Flocking (2)

- ▶ Couzin et al. 2005
  - ▶ Considered how grouping animals make informed unanimous decisions
- ▶ Cucker and Huepe 2008, Ferrante et al. 2010, Yu et al. 2010
  - ▶ Used informed agents to influence flock
    - ▶ Behave in a fixed way that is predetermined on based on type
- ▶ Han et al. 2006
  - ▶ Studied how one agent can influence the direction in which a flock of agents is moving
  - ▶ Utilized one robot with unlimited, non-constant velocity

# Summary

- ▶ Scaled placement approach
- ▶ Hybrid placement approach
- ▶ Behavior when able to position ahead of flock

## Research Problem:

Given computational limitations, how should influencing agents be placed within a flock? How should influencing agents join a flock in motion if they are able to arrive ahead of the flock?

