

# Territory Partitioning for Gossiping Agents

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<http://motion.mee.ucsb.edu>

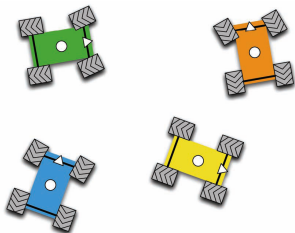
3rd Workshop on Swarming in Natural and Engineered Systems  
Block Island, June 3-4, 2009

# Distributed Control of Robotic Networks

Princeton Series in APPLIED MATHEMATICS

## Distributed Control of Robotic Networks

A Mathematical Approach  
to Motion Coordination Algorithms



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Jorge Cortés  
Sonia Martínez

- 1 intro to distributed algorithms (graph theory, synchronous networks, and averaging algos)
- 2 geometric models and geometric optimization problems
- 3 model for robotic, relative sensing networks, and complexity
- 4 algorithms for rendezvous, deployment, boundary estimation

**Status:** Freely downloadable at <http://coordinationbook.info> with tutorial slides and (ongoing) software libraries.

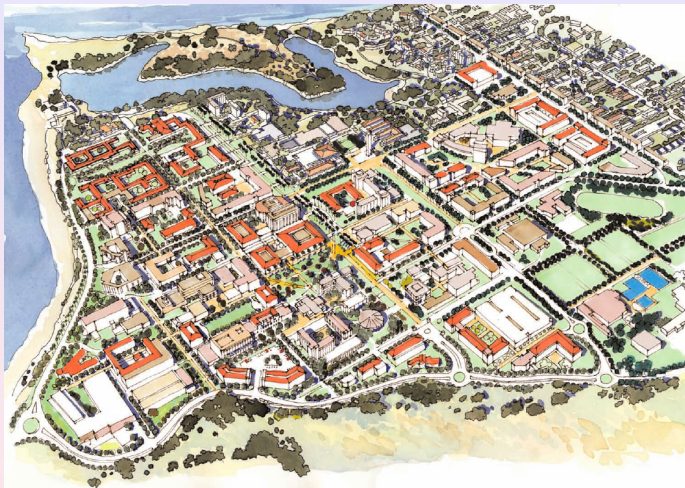
F. Bullo, J. Cortés, and S. Martínez. *Distributed Control of Robotic Networks*. Applied Mathematics Series. Princeton Univ Press, 2009. ISBN 978-0-691-14195-4

# Territory partitioning is ... art



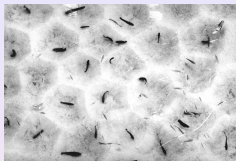
Ocean Park Paintings, by Richard Diebenkorn (1922-1993)

# Territory partitioning is ... centralized space allocation



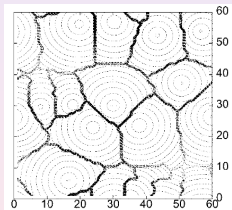
UCSB Campus Development Plan, 2008

# Territory partitioning is ... animal territory dynamics



*Tilapia mossambica*, "Hexagonal Territories,"

Barlow et al, '74

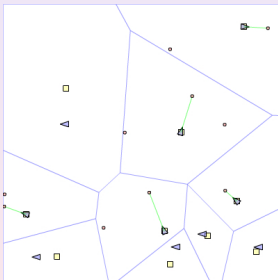


Red harvester ants,  
"Optimization, Conflict, and  
Nonoverlapping Foraging  
Ranges," Adler & Gordon, '03

- (exploitation + conflict) predict nonoverlapping foraging regions for distinct colonies
- "Deviations between model predictions and data indicate that colonies might allocate a larger than optimal number of foragers to areas near boundaries between foraging ranges."

# Territory partitioning is ... robotic load balancing

- targets/customers appear randomly space/time
- robotic network knows locations and provides service
- goal: minimize wait time



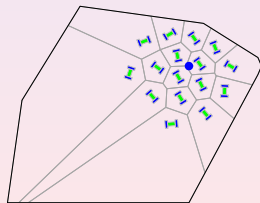
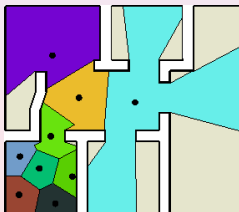
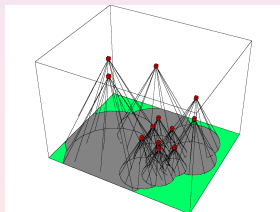
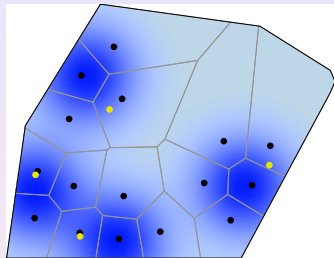
M. Pavone, E. Frazzoli, and F. Bullo. Decentralized algorithms for stochastic and dynamic vehicle routing with general target distribution. In *Proc CDC*, pages 4869–4874, New Orleans, LA, December 2007

# Distributed partitioning+centering algorithm

## Partitioning+centering law

At each comm round:

- 1: acquire neighbors' positions
- 2: compute own dominance region
- 3: move towards centroid of own dominance region



# Multi-center optimization

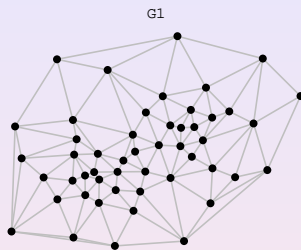
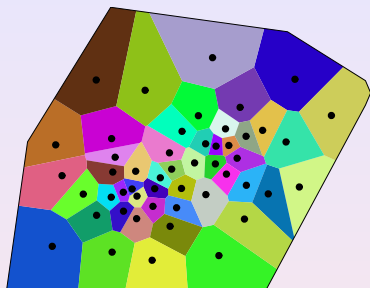
- place  $n$  robots at  $p = \{p_1, \dots, p_n\}$
- partition environment into  $v = \{v_1, \dots, v_n\}$
- define expected deviation

$$H(v, p) = \int_{v_1} \|q - p_1\| dq + \dots + \int_{v_n} \|q - p_n\| dq$$

## Theorem (Lloyd '57 “least-square quantization”)

- 1 *at fixed partition, optimal positions are centroids*
- 2 *at fixed positions, optimal partition is Voronoi*
- 3 *alternate  $p$ - $v$  optimization leads to local optimum*

# Today: What are minimal communication requirements?



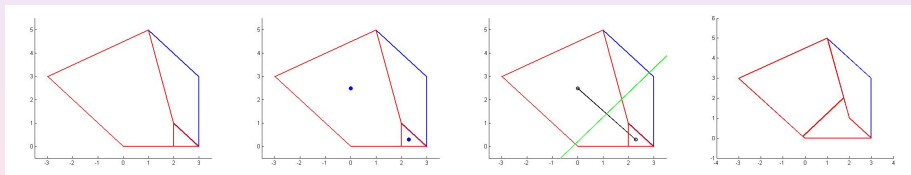
Lloyd partitioning+centering law requires:

- ① synchronous & reliable communication
- ② communication along edges of “adjacent regions graph”

what are minimal interaction requirements?

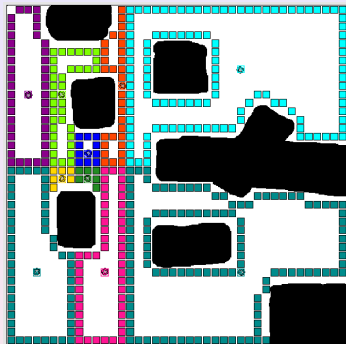
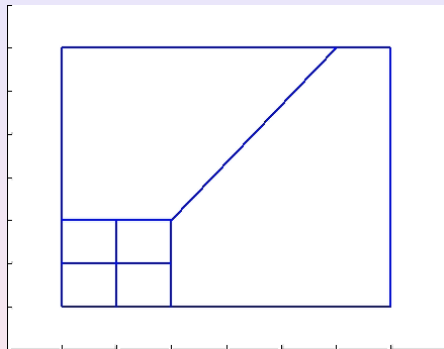
# Algo #1: Gossip partitioning policy

- 1 Random communication between two regions
- 2 Compute two centers
- 3 Compute bisector of centers
- 4 Partition two regions by bisector



P. Frasca, R. Carli, and F. Bullo. Multiagent coverage algorithms with gossip communication: control systems on the space of partitions. In *Proc ACC*, St. Louis, MO, June 2009. To appear

# Simulation results



Implementation in player/stage

# Algo #2: Randomized appointment protocols

Asynchronously each agent:

- 1: waits random time at random location near boundary;  
if neighbors appears, then region recomputation
- 2: performs vehicle routing for random time

- 1 bio-inspired boundary loitering  
“... larger than optimal number  
of foragers to areas near  
boundaries between foraging  
ranges”
- 2 bio-inspired region  
recomputation between  
gossiping agents



## state space:

- not finite-dimensional because a-priori arbitrary number of vertices
- non-convex disconnected polygons
- standard topology not ok

## #1 topology of partitions

Space of (relatively closed) partitions is metric and compact with respect to symmetric difference

## gossip map:

- ill-posed
- discontinuities
- not deterministic

## #2 map modification

well-posed and continuous

## #3 Lasalle invariance thm

- 1 persistent stochastic switching
- 2 common Lyapunov function
- 3 convergence to intersection set of fixed points

## #4 Randomized appointments

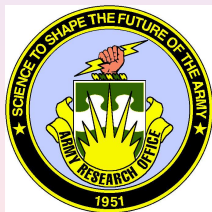
... are persistent stochastic

# Conclusions

## Summary

- 1 novel gossip partitioning algorithm
- 2 novel randomized appointment protocol
- 3 space of partitions + stochastic LaSalle

Thanks to:



ARO SWARMS Award



Paolo Frasca



Ruggero Carli