

# Nonholonomic Vehicle Routing and the Dubins TSP

RSS Workshop on Robotic Sensor Networks  
Atlanta, Georgia, June 2007

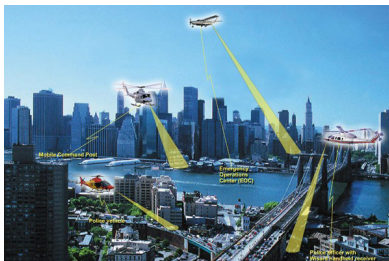
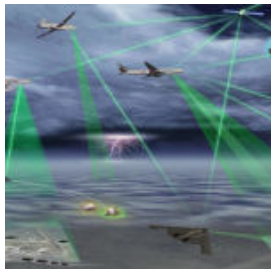
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Acknowledgements: **Ketan Savla, Emilio Frazzoli (MIT)**

# Emergent Unmanned Aerial Vehicle (UAV) technology



## Advantages

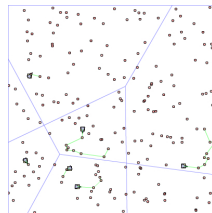
- surveillance
- data acquisition
- communication relays
- disaster and emergency management

## Key scientific challenges

- scalability in performance and robustness
- sensor models and dynamics
- how to integrate control, sensing, communication

# Vehicle Routing

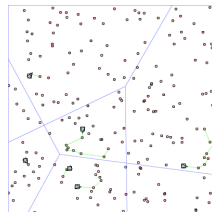
Service dynamically arriving targets  
via target assignment + path planning



vehicle routing by Frazzoli and Bullo, 2004

# Vehicle Routing

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## Problem setup: Dynamic Traveling Repairperson Problem (DTRP)

- $m$  vehicles with unit speed  
single integrator or Dubins nonholonomic
- random targets with time intensity:  $\lambda > 0$  — spatial density:  
uniform

**Objective:** a *stabilizing* policy with *minimum system time*

# Key requirement for stability

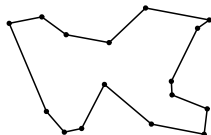
Suppose  $n = \#$  outstanding targets:

$$\underbrace{\lambda}_{\text{target generation rate}} - \frac{n}{\underbrace{\text{TSPlength}(n)}_{\text{target service rate}}} = \text{target growth rate}$$

If  $\text{TSPlength}(n)$  depends on  $n$  strictly sub-linearly, then growth rate becomes negative

# Euclidean TSP and Dubins TSP

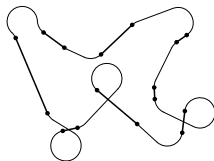
## Euclidean TSP (ETSP)



- NP-hard
- effective heuristics available
- $\text{length}(\text{ETSP}) \in O(\sqrt{n})$   
(Supowit et. al. '83)

## Dubins TSP (DTSP)

Given a set of points find the shortest tour with bounded curvature



- not a finite dimensional problem
- no prior algorithms or results
- $\text{length}(\text{DTSP})$  sub-linear in  $n$  ?

# Stochastic DTSP

## Problem Statement

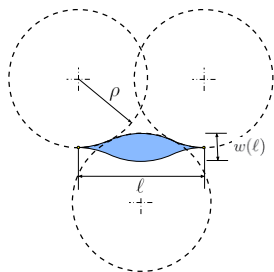
Given a set of  $n$  *independently and uniformly distributed* points, design algorithms with smallest *expected* DTSP tour length

## Lower bound

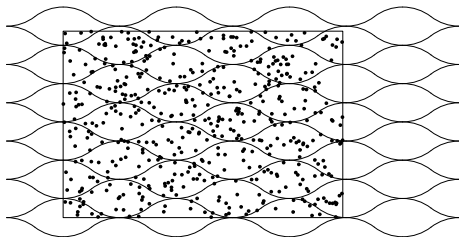
For  $n$  iid uniformly distributed points:

$$\mathbb{E}[\text{DTSP}] \in \Omega(n^{2/3})$$

# Bead Tiling of the plane



$\rho$ : minimum turning radius,  $\ell$ : length



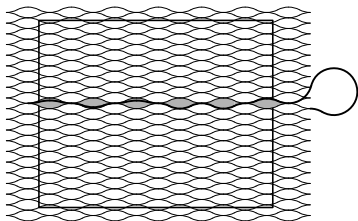
## Key properties of the bead

- 1 Beads tile the plane
- 2 Approaching and leaving a bead horizontally, Dubins can service a target anywhere in the bead (while remaining inside it)



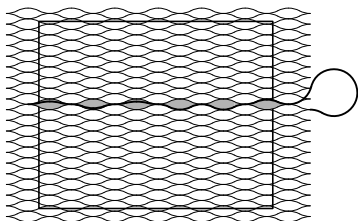
# Recursive Bead Tiling Algorithm (RecBTA)

Pick  $\ell$  so that  $\# \text{beads} = n$

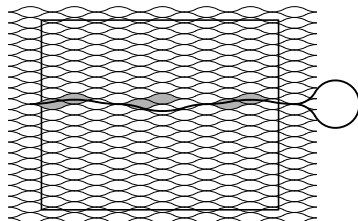


# Recursive Bead Tiling Algorithm (RecBTA)

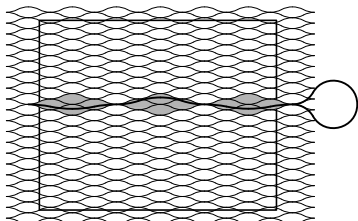
Pick  $\ell$  so that  $\# \text{beads} = n$



Phase 1



Phase 2



Phase 3

and so on ...

# Analysis of RecBTA

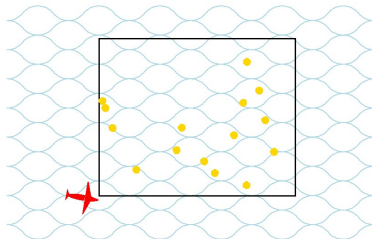
- ① path length to execute all phases of RecBTA  $\in O(n^{2/3})$
- ② # targets remaining after all phases  $\in O(\log n)$  with high probability (occupancy problem, stochastic analysis)
- ③ Hence, RecBTA is an asymptotic constant factor approximation whp

# DTRP algorithms

## Single vehicle case

### BEAD TILING ALGORITHM (BTA)

- 1: Tile with *appropriate* resolution
- 2: Traverse all non-empty beads once, visiting one target per bead
- 3: Repeat step 2



## Multiple vehicle case

### STRIP TILING ALGORITHM (STA)

- 1: Divide the plane into  $m$  equal strips along the height
- 2: Each vehicle executes BEAD TILING ALGORITHM in its strip

# Summary of prior and novel results

|                                      | Simple vehicle                | Double integrator                                 | Dubins vehicle                      |
|--------------------------------------|-------------------------------|---|-------------------------------------|
| Length of TSP tour (worst-case)      | $\Theta(n^{\frac{1}{2}})$     | $\Omega(n^{\frac{1}{2}})$<br>$O(n^{\frac{3}{4}})$ | $\Theta(n)$                         |
| Exp. Length of TSP tour (stochastic) | $\Theta(n^{\frac{1}{2}})$     | $\Theta(n^{\frac{2}{3}})$<br>w.h.p.               | $\Theta(n^{\frac{2}{3}})$<br>w.h.p. |
| System time for DTRP                 | $\Theta(\frac{\lambda}{m^2})$ | $\Theta(\frac{\lambda^2}{m^3})$                   | $\Theta(\frac{\lambda^2}{m^3})$     |

*The upper bounds are constructive*

# References

- ① K. Savla, E. Frazzoli, and F. Bullo. On the point-to-point and traveling salesperson problems for Dubins' vehicle. In *American Control Conference*, pages 786–791, Portland, OR, June 2005
- ② K. Savla, E. Frazzoli, and F. Bullo. Asymptotic constant-factor approximation algorithms for the traveling salesperson problem for Dubins' vehicle, March 2006. Available electronically at <http://arxiv.org/abs/cs/0603010>
- ③ K. Savla, E. Frazzoli, and F. Bullo. Traveling Salesperson Problems for the Dubins vehicle. *IEEE Transactions on Automatic Control*, 53(6):1378–1391, 2008
- ④ K. Savla. *Multi UAV Systems with Motion and Communication Constraints*. PhD thesis, Electrical and Computer Engineering Department, University of California at Santa Barbara, Santa Barbara, August 2007. Available electronically at <http://ccdc.mee.ucsb.edu>

# Emerging discipline: motion-enabled networks

- **network modeling**

network, ctrl+comm algorithm, task, complexity

- **coordination algorithm**

deployment, task allocation, boundary estimation

Papers available at <http://motion.mee.ucsb.edu>