# Optimal Control of Nonlinear Systems with Temporal Logic Specifications

Eric M. Wolff and Richard M. Murray California Institute of Technology



ISRR
16 December 2013

### **Autonomous Systems Doing Complex Tasks**







**US Navy** 

- How to specify complex tasks?
- How to handle high-dimensional, nonlinear dynamics?
- How to compute time or fuel optimal controllers?

# Temporal Logic

- Propositional logic:  $\land$  (and),  $\lor$  (or),  $\Longrightarrow$  (implies),  $\neg$  (not)
- Temporal operators:  $\mathcal{U}$  (until),  $\bigcirc$  (next),  $\square$  (always),  $\diamondsuit$  (eventually)



Autonomous driving



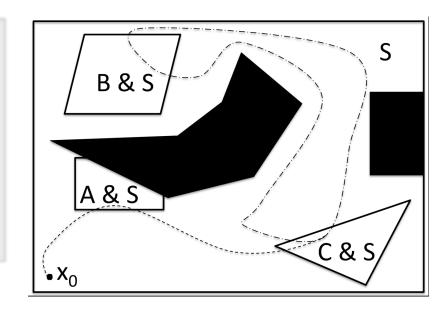
Bomb disposal

**Generalizes classical motion planning** 

### **Problem Statement**

#### Given

- nonlinear system
- temporal logic spec φ
- cost function J
- $\mathbf{x}(\mathbf{x}_0, \mathbf{u})$  is the trajectory



- $L(\mathbf{x}(\mathbf{x}_0,\mathbf{u}))$  is sequence of labels
- Goal

$$\min_{\mathbf{u}} J(\mathbf{x}(x_0,\mathbf{u}))$$

s.t. 
$$L(\mathbf{x}(x_0,\mathbf{u})) \models \varphi$$

(minimize cost)

(satisfy spec/task)

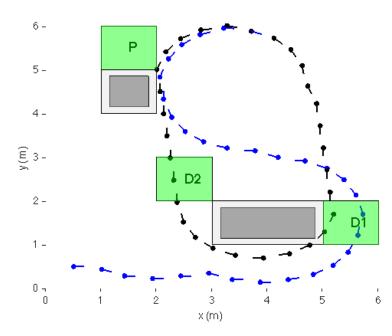
### **Solution Overview**



- 1. Parameterize trajectory as a lasso
- 2. Encode **temporal logic** with mixed- integer

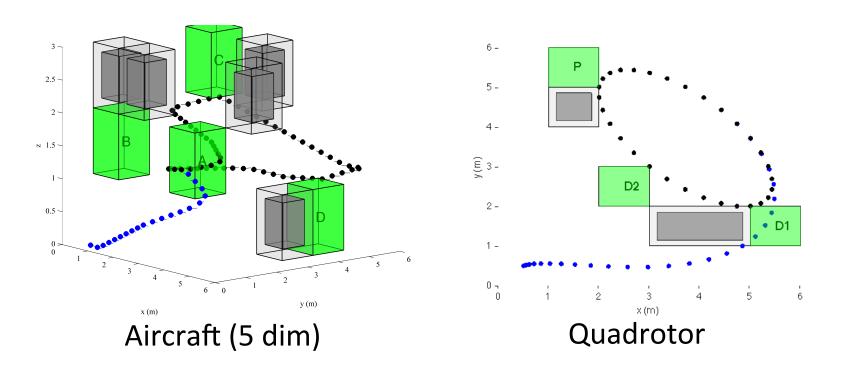
linear constraints on lasso

- 3. Add **dynamic** constraints
- 4. Solve resulting MILP



## **Computational Results**

- Order of magnitude improvement over abstractions
- Solutions for high-dimensional systems in seconds



**Task**: Repeatedly visit 3 regions and avoid obstacles

# Thank you!

Contact: Eric M. Wolff

– Email: <u>ewolff@caltech.edu</u>

– Web: <u>www.cds.caltech.edu/~ewolff/</u>

• Funding: NDSEG fellowship, Boeing, AFOSR



