

# LaValle 4.3

2/11/18

①

## 4.3.1: Def of Basic MP. Problem

Configuration space

$C$ -space

World

$$W = \mathbb{R}^2 \text{ or } \mathbb{R}^3$$

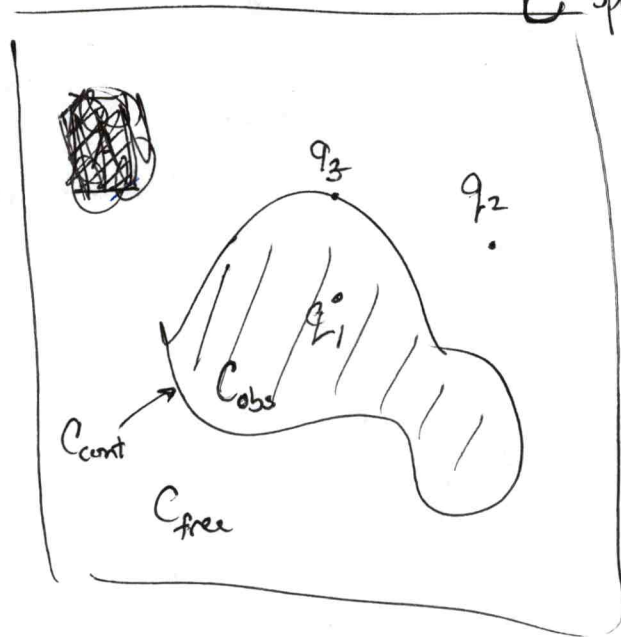
Obstacle region

$$O \subset W$$

a.k.a. "impermissible" region

Robot

$$A \subset W$$



Assume  $A \neq O$  are expressed as semi-algebraic models

Let  $q \in C$  be a configuration of the robot  $A$ .

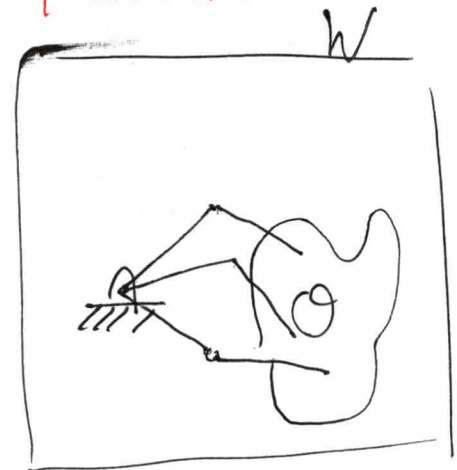
$$\text{In } W = \mathbb{R}^2, q = (x_t, y_t, \theta)$$

$$\text{In } W = \mathbb{R}^3, q = (x_t, y_t, z_t, h)$$

← unit quaternion

The obstacle region mapped into  $C$ -space

$$C_{obs} = \{q \in C \mid A(q) \cap O \neq \emptyset\}$$



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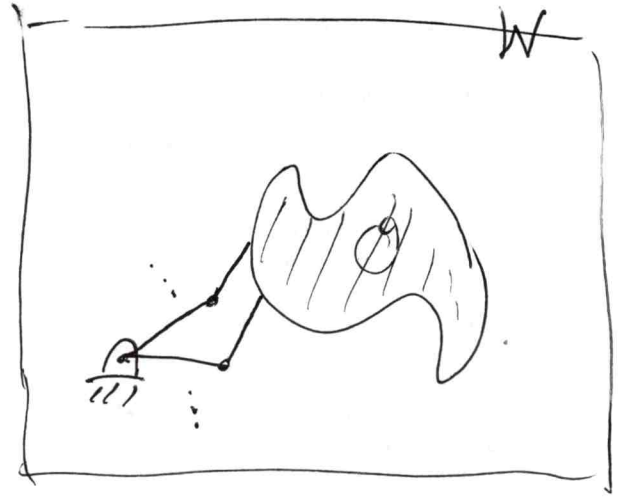
$$C_{free} = C \setminus C_{obs}$$

$$= \{q \in C \mid A(q) \cap O = \emptyset\}$$

$$C_{cont} = \{q \in C \mid \underbrace{int(O)} \cap \underbrace{int(A(q))} = \emptyset \text{ AND } O \cap A(q) \neq \emptyset\}$$

$cl(O) \cap cl(A(q))$

interior  
of a set



Motion Planning  
Problem general  
Formulation 4.1

① Given  $W = \mathbb{R}^n$  ( $n=2$  or  $3$ ),  $O$ ,  $A$ .

②  $C$ ,  $C_{obs}$ , &  $C_{free}$  are implicitly derived

③ Initial & goal configs are given  $q_I, q_G \in C_{free}$

↖ a.k.a. a planning query.

⊕ A planning alg computes a continuous path

$\tau: [0, 1] \rightarrow C_{free} \ni$  such that  $\tau(0) = q_I$  and  $\tau(1) = q_G$ ,

OR correctly report that a path does not exist,

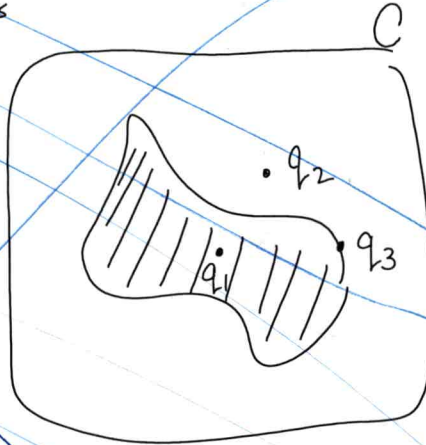
1980's  
or 1990's

Reif showed that this problem is PSPACE-hard  
which implies NP-hard!

4.3 The C-space Obstacle,  $C_{obs}$

Let  $q \in C$  denote  
a config. of the robot

Let  $A(q)$  be the robot  
in config  $q$ .



$$C_{obs} = \{q \in C \mid A(q) \cap \text{Int}(O) \neq \emptyset\}$$

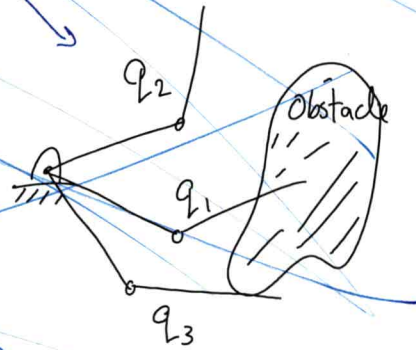
$$C_{cont} = \{q \in C \mid A(q) \cap O \neq \emptyset, \\ A(q) \cap \text{Int}(O) = \emptyset\}$$

equivalently,

$$C_{cont} = \partial C_{obs}$$

$$C_{free} = C \setminus (C_{obs} \cup C_{cont}) = C \setminus \text{cl}(C_{obs})$$

↑ closure of a set



4.3.2 Explicit representations of  $C_{cont} = \partial C_{obs}$

(LaValle treats  $C_{obs}$  and  $C_{obs} \cup C_{cont} = \text{cl}(C_{obs})$ )

Definition: Minkowski difference of two sets in  $\mathbb{R}^n$

$$X \ominus Y = \{x - y \in \mathbb{R}^n \mid x \in X, y \in Y\}$$

Each set has a  
reference frame  
.....

$$X \ominus Y = \{x - y \in \mathbb{R}^n \mid x \in X, y \in Y\}$$

↑  
vector subtraction

... sets in a reference frame embedded in it.

Definition: Minkowski sum

$$X \oplus Y = \{x + y \in \mathbb{R}^n \mid x \in X, y \in Y\}$$

↑  
vector addition

Note:  $X \ominus Y = X \oplus (-Y)$  where  $-Y$  is the set of negated elements of  $Y$ .

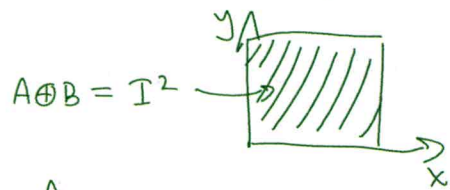
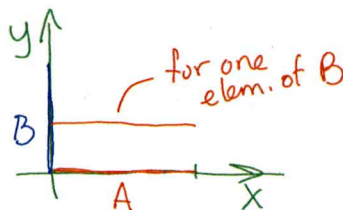
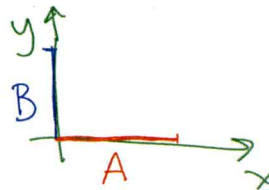
Example in  $\mathbb{R}^2$

Let  $A = I = ([0, 1], 0) =$  interval on x-axis

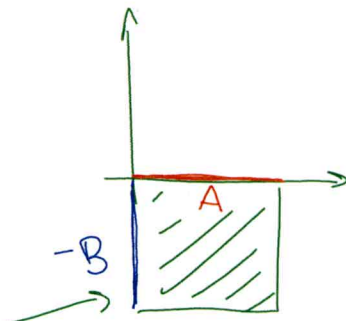
$B = I = (0, [0, 1]) =$  interval on y-axis

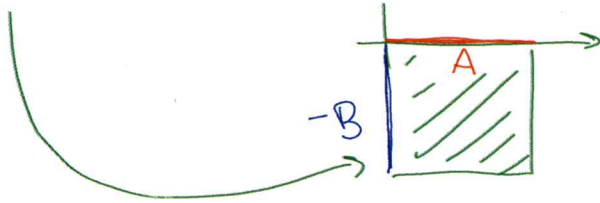
What is  $A \oplus B$ ?

Add every element of  $A$   
to every element of  $B$



$A \ominus B = ? \rightarrow$



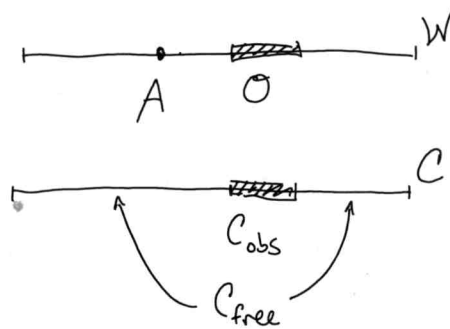


Using  $\Theta$  to determine  $C_{free} \neq C_{obs}$

Simplest case: A is a particle.

It can be reasonable to treat robot as a point, if features in World are much larger than robot.

1D world

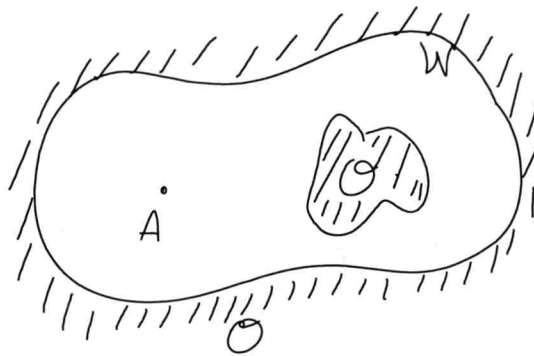


2D world

Again  $C_{obs} = \text{Int}(\Theta)$

$C_{cont} = \partial\Theta$

$C_{free} = W \setminus \text{cl}(\Theta)$



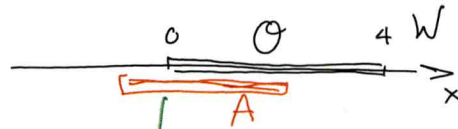
Same for 3D worlds

Robots of finite extent:

1D:

Let  $A = [-1, 2]$

$O = [0, 4]$



To create  $C_{obs}$ ,  $C_{cont}$ ,  $C_{free}$ , we need a ref. pt. on A. (Choose the zero point)

$O$  represents possible positions of A by possible positions of the ref. point.

Create the  $C_{obs}$  by negating A, then placing the ref. point at every point in  $O$ . Perform union of all placed copies of  $-A$ .

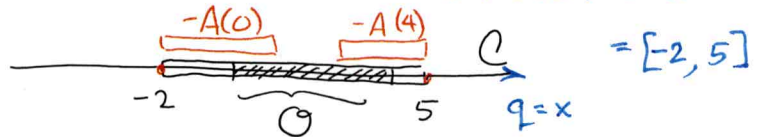
$cl(C_{obs}) = O \oplus -A =$

$[0, 4] \oplus [-2, 1] =$

$\begin{matrix} \downarrow & & \downarrow & \dots & \downarrow \\ [-2, 1] \cup [-1, 2] \cup \dots \cup [2, 5] \end{matrix}$

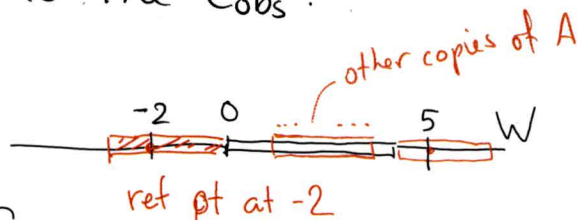
$cl(C_{obs}) = [-2, 5]$

$C_{obs} = \{x | -2 \leq x \leq 5\}$



Alternative view: place  $A(q)$  at every  $q$  where  $A \neq O$  overlap or touch. The union of the ref pt locations is the  $C_{obs}$ .

$C_{free} = \{x | x < -2 \vee x > 5\}$

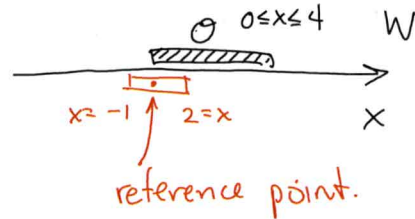


$$C_{\text{cont}} = \{x \mid x = -2 \vee x = 5\} \quad \text{just touching}$$

Why do we define  $C_{\text{obs}}$  by  $\mathcal{O} \oplus (-A)$  instead of  $\mathcal{O} \oplus A$ ?

Consider 1D case:

Write the non-collision constraint for the left side of  $\mathcal{O}$ :



position of pt on robot relative to ref pt.  $\rightarrow$  position of ref pt in  $W$

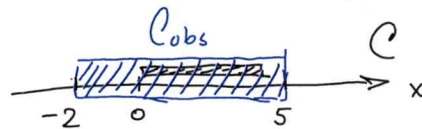
$$x + a < \sigma, \quad \forall a \in A(x), \quad \forall \sigma \in \mathcal{O}$$

point on obstacle in  $W$

$$\Rightarrow x < \sigma - a, \quad \forall a \in A(x), \quad \forall \sigma \in \mathcal{O}$$

This is Definition of Minkowski difference

Worst case:  $x < -2$

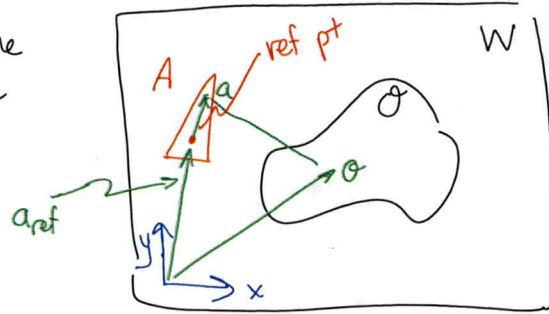


You can apply on right also

$$x > \sigma - a, \quad \forall a \in A, \quad \forall \sigma \in \mathcal{O}$$

Worst case:  $x > 5$

2D example works the same way, but constraints are more complicated



pt on robot,  $\mathcal{N}$

$$\mathcal{N} = a_{ref} + a, \quad a \in A(q)$$

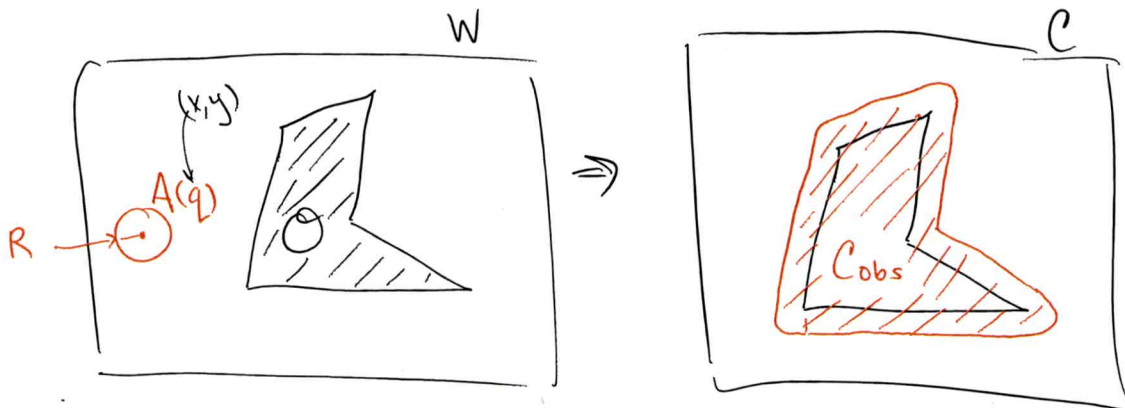
(x,y)

$q \in C_{obs}$  if  $a_{ref} + a = o$  for some  $o \in O$   
for some  $a \in A$

$q \notin C_{obs}$  if  $a_{ref} \neq o - a, \forall a \in A(q), \forall o \in O$

Minkowski difference.

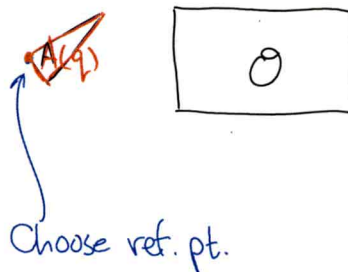
Disc robot ← Minkowski sum = Minkowski difference



Planar Translation Only Robot.

$C_{free}$  is set of positions of ref.

point  $\ni A \cap O = \emptyset$

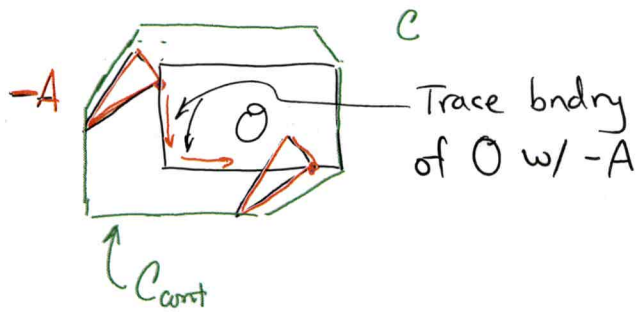




mouse ver. pr.

$$cl(C_{obs}) = \mathcal{O} \oplus -A$$

Add  $-A$  to every point in  $\mathcal{O}$



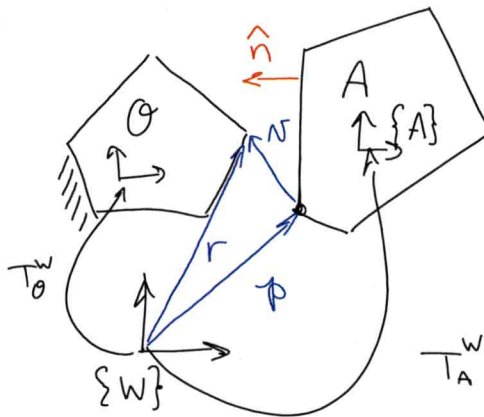
Skip to next page - star alg.

David Hsu's slides have a few nice pictures & animations.

Formulas for the boundary of  $C_{obs}$

for planar world with

$\mathcal{O}$  &  $A$  defined as polygons



Show Best Figure

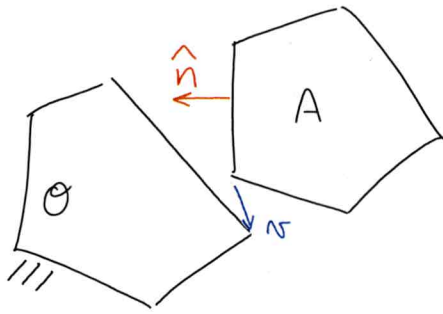
EV Contact -

edge of robot in contact with vertex of  $\mathcal{O}$ .

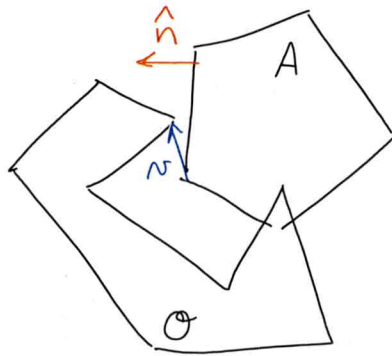
- $\hat{n} \cdot n = 0$  potential contact
- $\hat{n} \cdot n < 0$  potential penetration
- $\hat{n} \cdot n > 0$  local separation

$n = r - p$

Why the qualifiers?



$\hat{n} \cdot N \leq 0$ ,  
but no contact  
or penetration



$\hat{n} \cdot N \geq 0$ , but  
penetration occurs  
(non-locally).

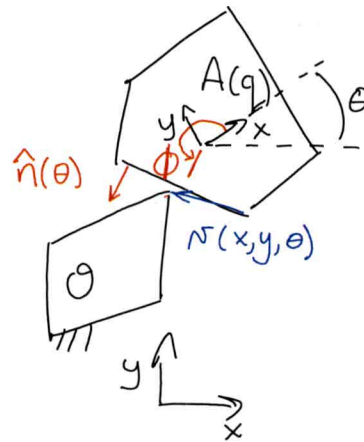
To obtain manifold of a given facet, write  
contact condition as a function of  $q = \begin{bmatrix} x \\ y \\ \theta \end{bmatrix}$

Necessary condition  
for contact:

$$\hat{n}(\theta) \cdot N(x, y, \theta) = 0$$

Let  $\phi$  denote the  
angle from the body-fixed  
x-axis to the normal  
direction

$$\hat{n}(\theta) = \begin{bmatrix} \cos(\phi + \theta) \\ \sin(\phi + \theta) \end{bmatrix}$$



Let body-fixed  
frame be  $\{A\}$

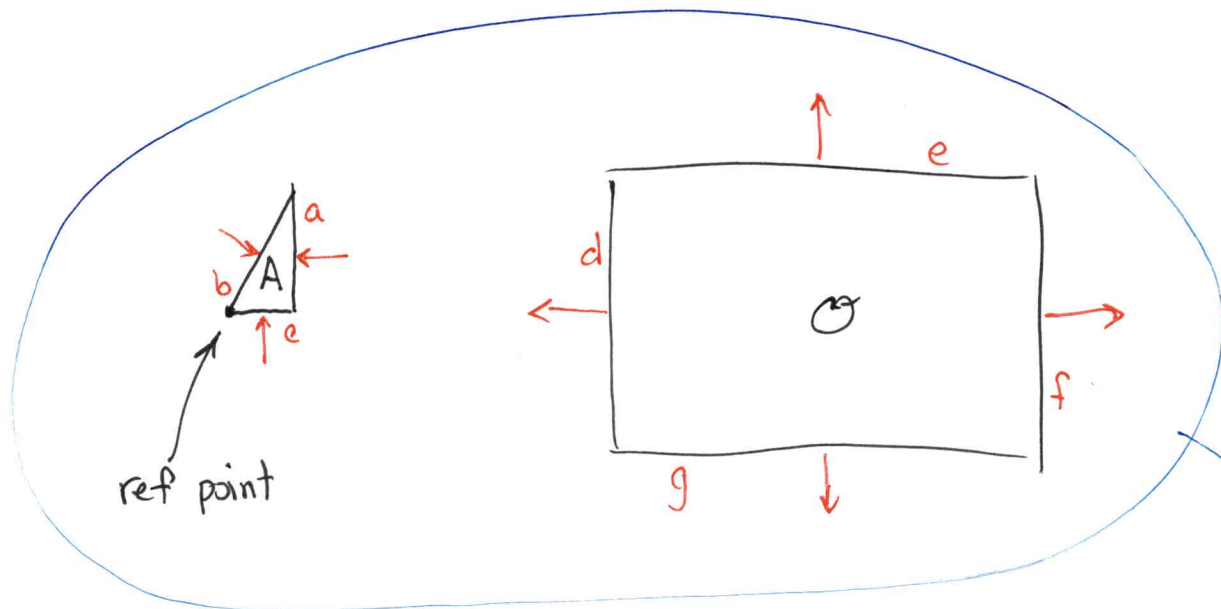
position of  $\theta$  in

# Star Alg for making C-space obstacles

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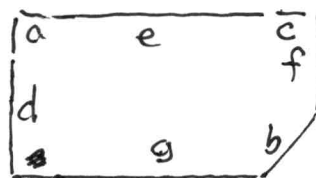
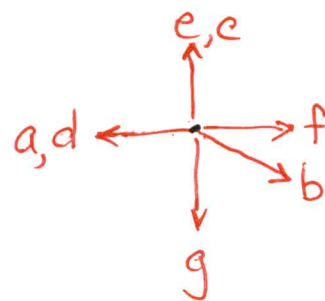
in C-spaces with polygonal bodies w/o rotation.



The  $C_{obs}$  can be constructed by laying down the edges of  $A \neq O$  in order of face normals

Easiest w/ ref pt on bndry

- ① Translate A so ref pt touches edge of O w/o overlap. Keep that edge in  $C_{obs}$ .
- ② Walk list of sorted normals placing that edge onto current end of  $C_{obs}$



$$N^W = r^W - p^W = r^W - T_A^W p^A$$

position of p in frame A

$$T_A^W = \begin{bmatrix} c_\theta & -s_\theta & x \\ s_\theta & c_\theta & y \\ 0 & 0 & 1 \end{bmatrix} \in SE(2)$$

$$N(x, y, \theta) = \begin{bmatrix} r_x - c_\theta p_x^A + s_\theta p_y^A - x \\ r_y - s_\theta p_x^A - c_\theta p_y^A - y \end{bmatrix}$$

position of obstacle vertex in W
position of origin of robot frame in W

Substitute into  $\hat{n}(\theta) \cdot N(x, y, \theta) = 0$

$$0 = \cos(\theta + \phi) [r_x - c_\theta p_x^A + s_\theta p_y^A - x] + \sin(\theta + \phi) [r_y - s_\theta p_x^A - c_\theta p_y^A - y]$$

(This eq. defines a 2D "variety" in 3D C-space  $(x, y, \theta)$ ).

Nonlinear trigonometric polynomial in  $\theta$   
(e.g.,  $\cos(\theta + \phi) \cdot \cos(\theta)$ )

Linear in  $(x, y)$  ..... This is why Cobs has linear surfaces for fixed orientations of A.

$$\boxed{ax + by + c = 0}$$

where  $a = -\cos(\theta + \phi)$ ,  $b = -\sin(\theta + \phi)$ ,

$$\text{and } c = \cos(\theta + \phi) [r_x - c_\theta p_x^A + s_\theta p_y^A] + \sin(\theta + \phi) [r_y - s_\theta p_x^A - c_\theta p_y^A]$$

Setting this contact eq. = 0 yields a 2D manifold in a 3D space  $(\mathbb{R}^2 \times S^1) = SE(2)$

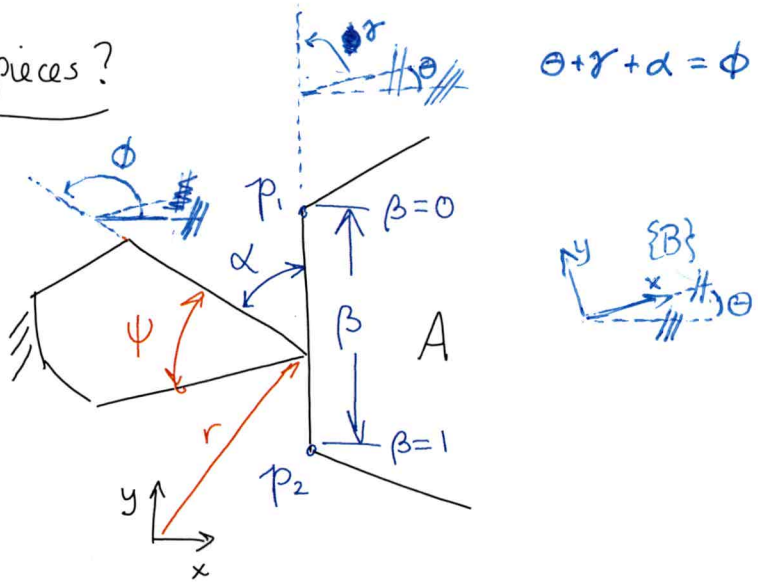
Pieces of this manifold appear in Brost's Cobs

How do we get the pieces?

Another useful formulation ...

$$0 \leq \alpha \leq \pi - \psi$$

$$0 \leq \beta \leq 1$$



$r$  must be on the line segment  $\overline{p_1 p_2}$

$$\begin{bmatrix} p_{ix}^w \\ p_{iy}^w \\ 1 \end{bmatrix} = \begin{bmatrix} c_\theta & -s_\theta & x \\ s_\theta & c_\theta & y \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} p_{ix}^A \\ p_{iy}^A \\ 1 \end{bmatrix}$$

$$i = 1, 2$$

given in geom. model

Substitute  $p_1^w, p_2^w$  into:

$$(1-\beta)p_1^w(x, y, \theta) + \beta p_2^w(x, y, \theta) = r$$

$$0 \leq \beta \leq 1$$

$$0 \leq \alpha \leq \pi - \psi$$

$$\leftarrow \alpha = \phi - \gamma - \theta$$

Choose  $\alpha, \beta$  and solve for  $x, y, \theta$  to get a point on Cobs

If  $A \neq \emptyset$  are convex, then this is a patch of Cobs

If  $A$  or  $\emptyset$  are nonconvex, then some of this patch may be cut away by nonlocal interpenetrations!

Other contact types.

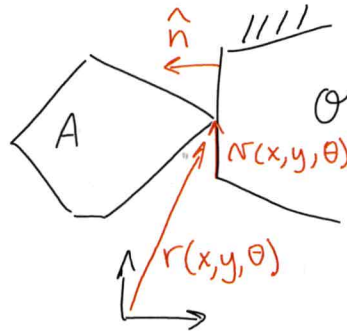
VE contact :

Same procedure, but

$\hat{n}$  is constant

$N$  is  $N(x, y, \theta)$

$r$  is  $r(x, y, \theta)$

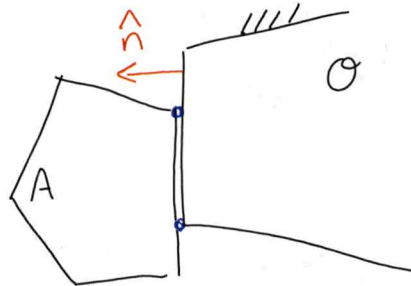


VE  $\Rightarrow$  2D facet. of  $C_{obs}$

EE contact :

Treat as two contacts of type

EV or VE



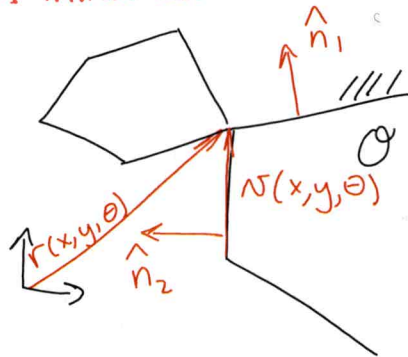
EE  $\Rightarrow$  1D facet of  $C_{obs}$

However forming equations w/o rotation variable  $\theta$  makes the equation much easier to solve.

VV contact :

Treat as two contacts of type

EV or VE



VV  $\Rightarrow$  1D facet of  $C_{obs}$

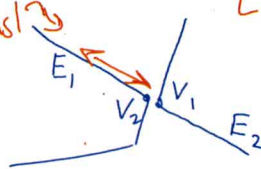
VV contact eq gives the points on a curved facet on  $C_{obs}$ , where EV  $\neq$  VE facets meet

Yes... also (EV EV)  $\cap$  (VE VE)  $\cap$  (EV VE)

You can choose  $(EV, EV)$  or  $(VE, VE)$  or  $(EV, VE)$

1 Dof transl allowed

doesn't always work



Simple example of a  $C_{obs}$  in  $SE(2)$ .

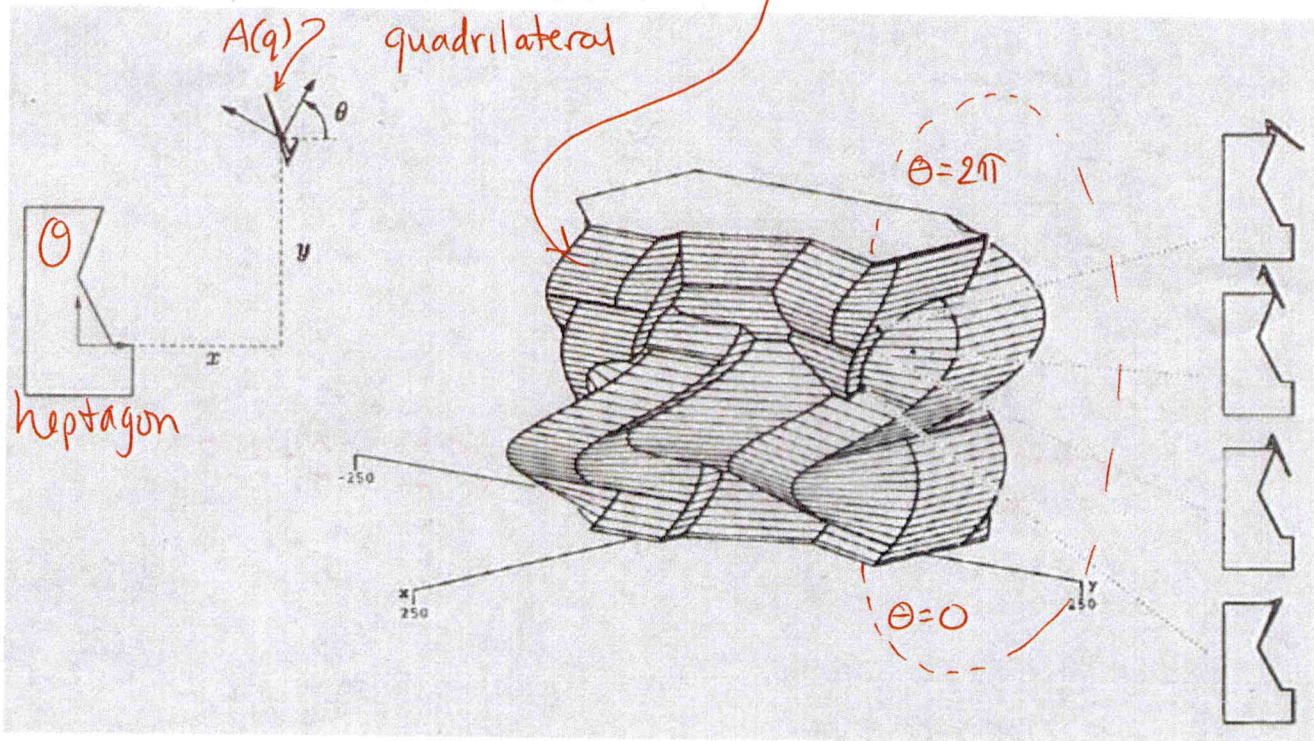
How many facets are there?

At most:

$$|E_1| = 4 = |V_1| \Rightarrow 28(E, V) \text{ pairs}$$

$$|E_2| = 7 = |V_2| \Rightarrow 28(V, E) \text{ pairs}$$

From Randy Brost's Thesis, CS, CMU, 1989.

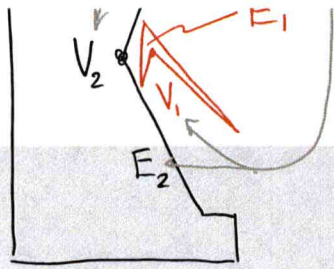


One infeasible  $(E, V)$  pair. There are 8 total.

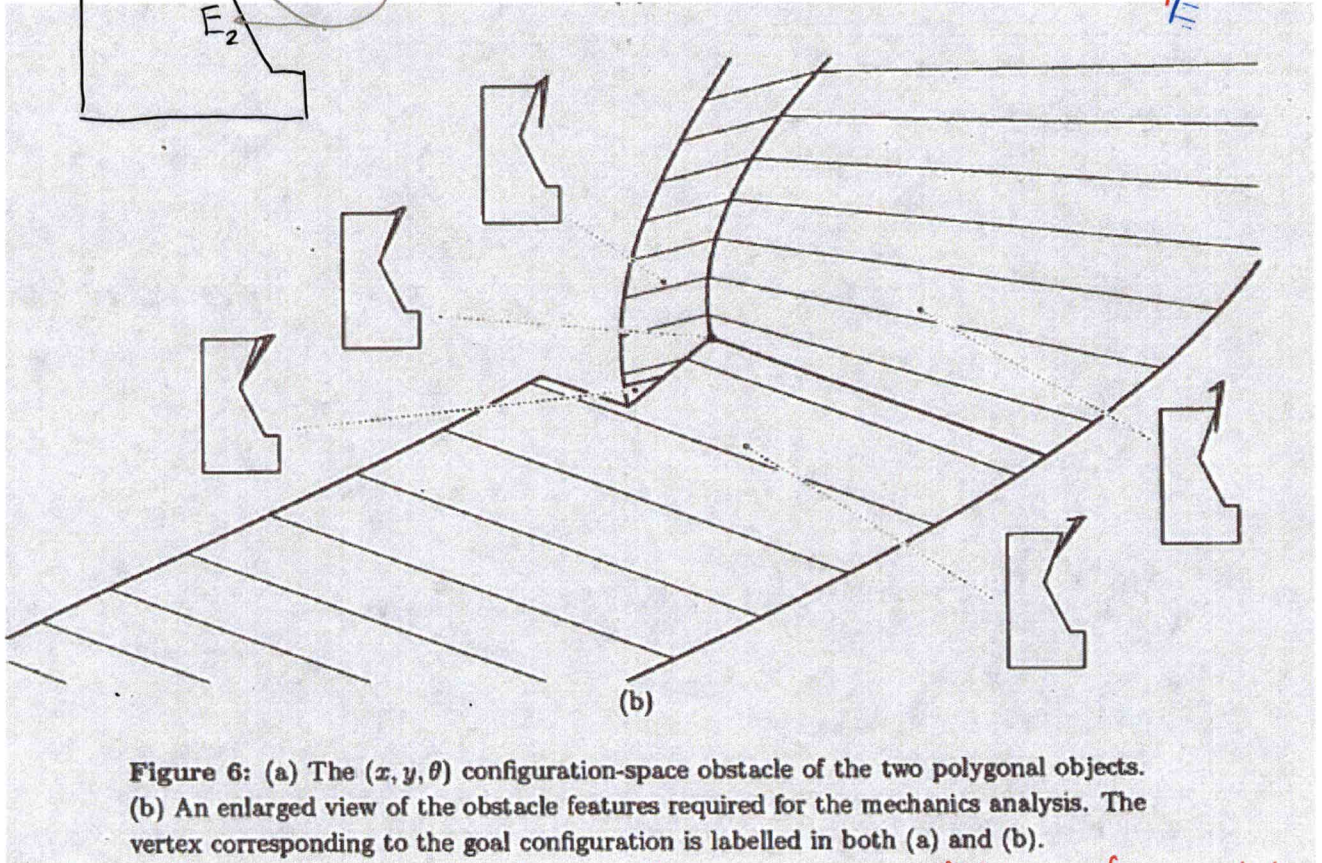
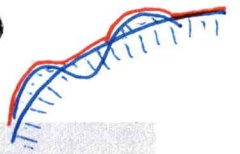
There are 7  $(E, V)$  infeasible  $(E, V)$  pairs.



$$\therefore C_{obs} \text{ has at most } 56 - \frac{13}{1} = 43$$



$\therefore C_{obs}$  has at most  $56 - 13 = 43$  2D facets?



It's possible that some facets could appear as multiple surface patches, since portions could go under other facets.

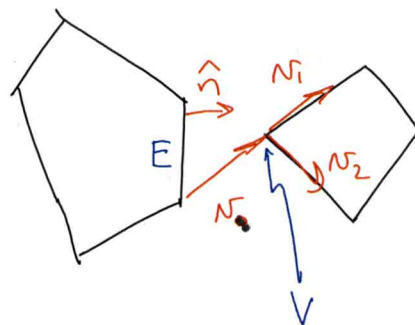
### Collision Checking for Polygons

Assume polygons are convex  
(can partition non-convex ones)

#### Theorem :

A pair of convex polygons are separated iff  $\exists$  a vertex/edge pair  $(E, V) \Rightarrow$

$$\hat{n} \cdot \vec{n} > 0$$





$$\hat{n} \cdot N_1 > 0$$

$$\hat{n} \cdot N_2 > 0$$

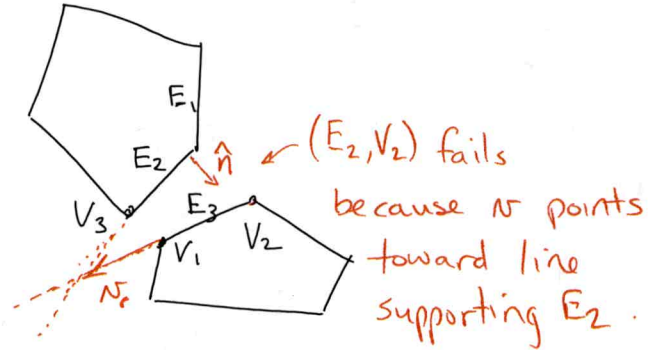
Example:  $\longrightarrow$

$(E_1, V_1)$  fails test

$(E_2, V_2)$  fails

$(E_3, V_3)$  succeeds

$(E_2, V_1)$  succeeds too



## Collision Detection for Convex Polygons

$q\_in\_Cfree = false$

while  $q\_in\_Cfree = false$

loop over all EV & VE pairs

if  $(\hat{n} \cdot N_1 > 0)$  AND  $(\hat{n} \cdot N_2 > 0)$  AND  $(\hat{n} \cdot N) > 0$

$q\_in\_Cfree = true$

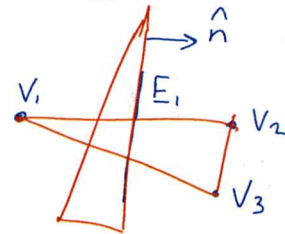
break

end if

end while

Does this work for this case?

$\forall E_i, i=1,2,3$   
 $\forall j=1,2,3$  } satisfied



$\forall_j E_i, \begin{matrix} i=4,5,6 \\ j=4,5,6 \end{matrix}$  satisfied

Yes! It works!

Complexity:

Let  $|V_A|$  &  $|V_O|$  be the numbers of vertices of the robot,  $A$ , and the obstacle,  $O$ .

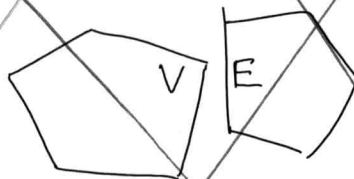
For each vertex-edge pair there are 3 inequalities to test  $\Rightarrow O(1)$

There are  $O(|V_A| \cdot |V_O|)$  EV and VE pairs.

$\therefore$  Collision detection is  $O(|V_A| \cdot |V_O|)$

Lavalle's discussion in section 4.3.3 focuses on the negation of the collision-free conditions:

Consider 1 EV pair  $\rightarrow$

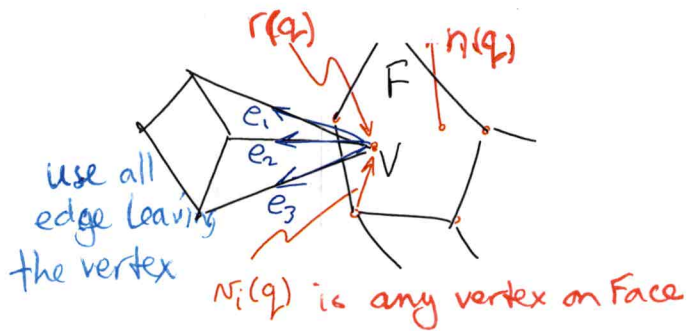


Let  $H_A = H_1 \cup H_2 \cup H_3$

where  $H_1 = \{q \in C \mid \hat{n} \cdot n_1 \leq 0\}$  } negations of previously

What about 3D?

Extension is analogous but a bit more complicated.



$q \in C_{\text{free}}$  if

$\exists$  a V-F or F-V pair  $\ni$

$$\hat{n} \cdot \nu > 0$$

$$\hat{n} \cdot e_i > 0 \quad i = 1, \dots, \# \text{ edges}$$

A facet of  $C_{\text{obs}}$  would be defined by  $\hat{n} \cdot \nu = 0$  and  $r(q)$  within the boundaries of face  $F$ .

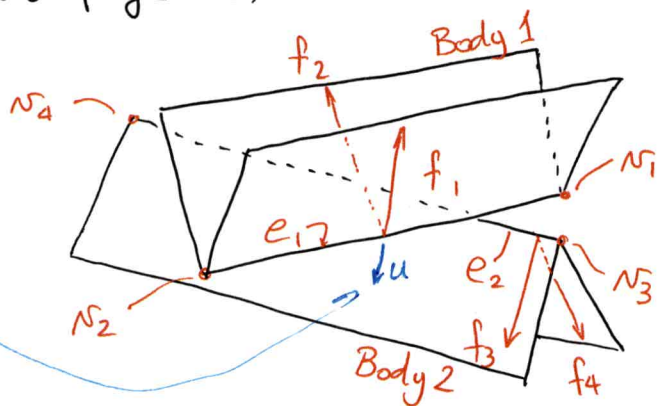
In 3D we have another case, E-E.

(this extends beyond Lavelle page 165)

Let  $u = e_1 \times e_2$

$$\hat{u} = u / \|u\|$$

(outward wrt Body 1)



$$(\nu_3 - \nu_1) \cdot \hat{u} > 0 \Rightarrow e_1 \neq e_2 \text{ are separated}$$

$f_1, f_2$  are vectors in faces of Body 1 &  $\perp$  to  $e_1$

$f_1 \cdot \hat{u} \leq 0 \Rightarrow$  no overlap

$f_2 \cdot \hat{u} \leq 0 \Rightarrow$  no overlap

$f_3, f_4$  are vectors in faces of B2 &  $\perp$  to  $e_2$

$f_3 \cdot \hat{u} > 0 \Rightarrow$  no overlap

$f_4 \cdot \hat{u} > 0 \Rightarrow$  no overlap

### 3D Collision Checking

$q\_in\_Cfree = false$

```
loop  
over  
all  
FV  
VF  
EE  
pairs  
[ while  $q\_in\_Cfree = false$   
  [ if (separation condition satisfied)  
    [  $q\_in\_Cfree = true$   
    [ break  
  [ end if  
end while
```

Complexity of CD in 3D.

[Latombe'91] It is known that the # of VF, FV, and EE pairs is  $O(|V_A| \cdot |V_O|)$ .

### Fast collision checking - intuition

If relative config does not change much, and polygons were not in collision at previous check, it should be "easy" to find the definitive witness pair.

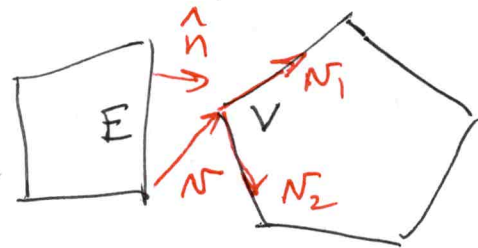
# Section 4.3.3: Explicitly Modeling Collisions

2/12/18  
①

Summary: Use primitives based on negation of the collision-free condition mentioned above.

Consider 2 convex polygons

Let  $H_A = H_1 \cup H_2 \cup H_3$



where

$$H_1 = \{q \in \mathbb{C} \mid \hat{n} \cdot n_1 \leq 0\}$$

$$H_2 = \{q \in \mathbb{C} \mid \hat{n} \cdot n_2 \leq 0\}$$

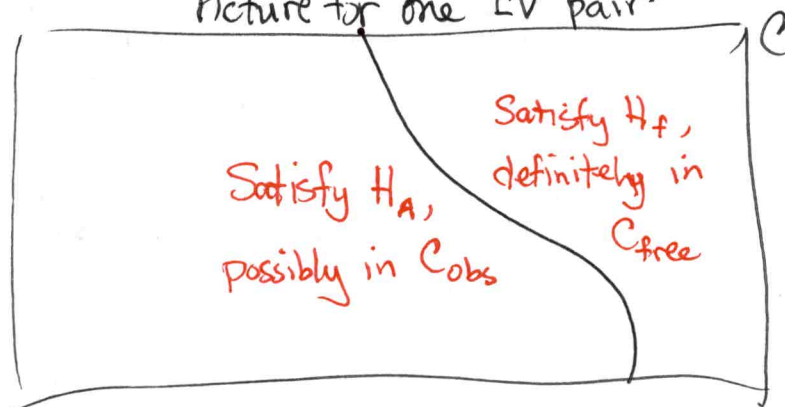
$$H_3 = \{q \in \mathbb{C} \mid \hat{n} \cdot n < 0\}$$

negations of previously defined collision-free conditions

$$C_{free} = \{q \in \mathbb{C} \mid \text{for some EV or VE pair, } (\hat{n} \cdot n_1 \geq 0 \wedge \hat{n} \cdot n_2 \geq 0 \wedge \hat{n} \cdot n > 0)\}$$

$$C_{obs} = \{q \in \mathbb{C} \mid \text{for all pairs EV } \neq \text{VE, } (\hat{n} \cdot n_1 < 0 \wedge \hat{n} \cdot n_2 < 0 \wedge \hat{n} \cdot n \leq 0)\}$$

Picture for one EV pair



More EV, VE pairs cause more cuts to approximate  $C_{obs}$  until all are done.

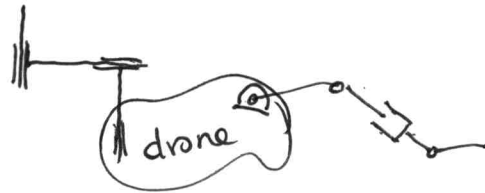
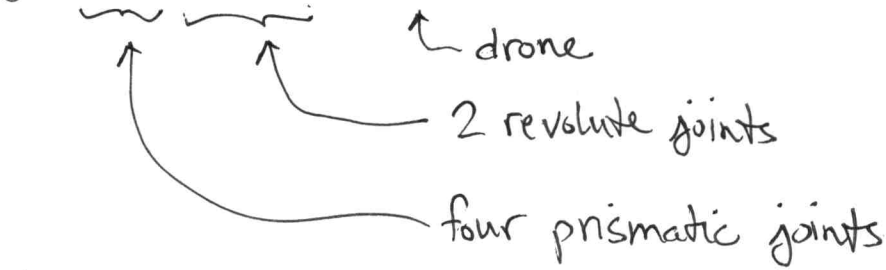
# Lalvalle Ch4.4: Closed Kinematic Chains

2/11/18

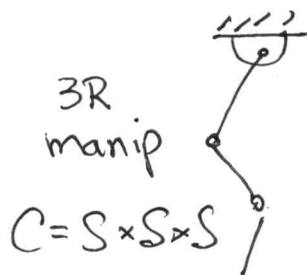
(4)

The C-space of open chains is just the product of C-spaces of each joint

e.g.  $\mathbb{R}^4 \times S^1 \times S^1 \times SE(3)$



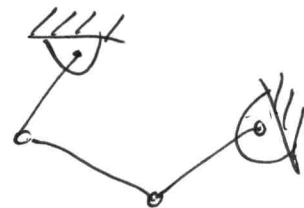
The constraints associated with closing ~~the~~ a loop with kinematic chains, fundamentally changes the structure of C-space.



3R manip  
 $C = S \times S \times S$   
 If joint limits exist,

$C = I \times I \times I = I^3$

Now close  
 the loop



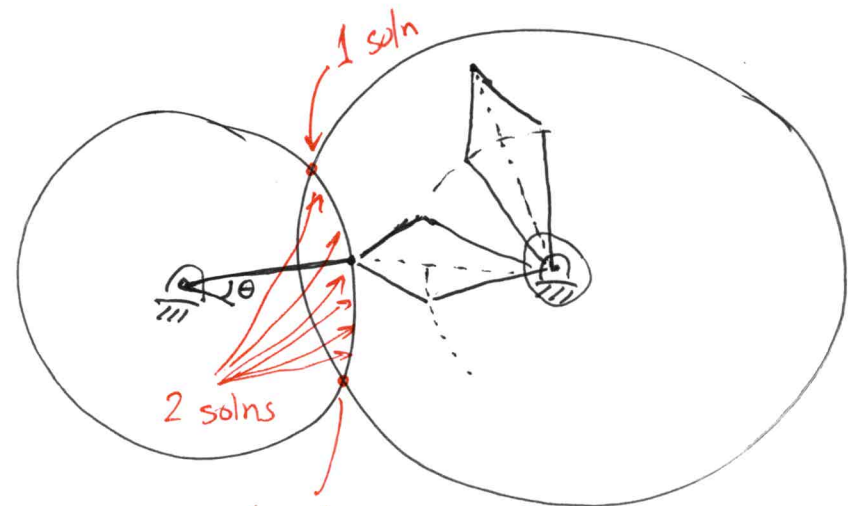
What's a good parameterization?  
 Now C-space is one-dimensional, not 3D.

parameterization?

2/11/18

(5)

Global structure of C-space for a planar four-bar.

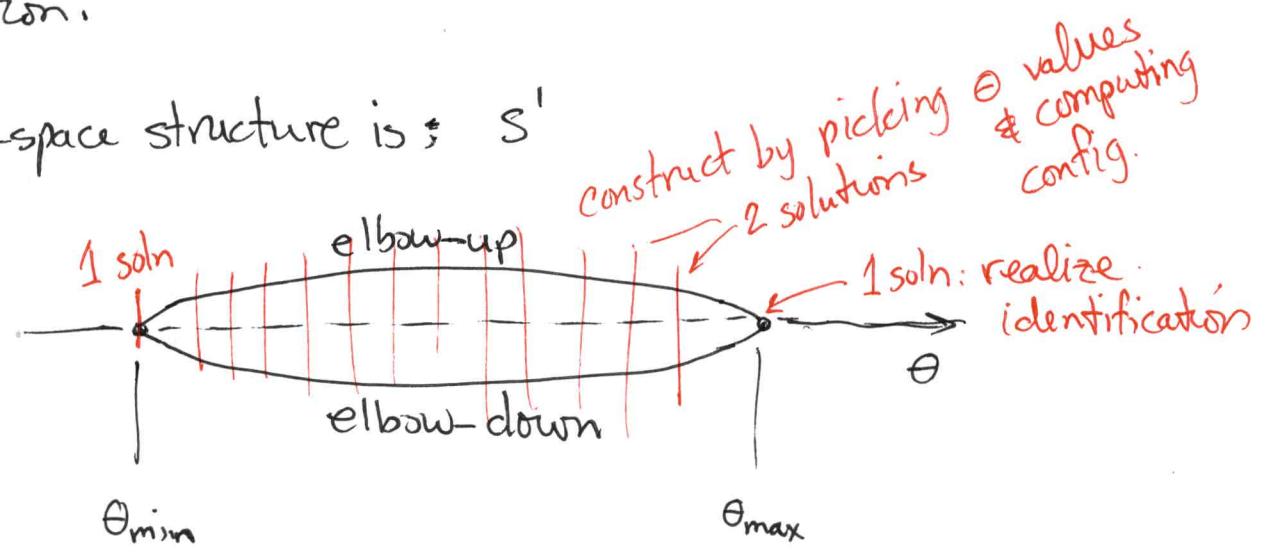


As  $\theta$  changes the 2R on the right always has 2 solns; elbow-up and elbow-down.

↑ This circle is in some sense critical to C-space structure.

Until it gets to an extreme position of its range of motion. Then elbow-up soln  $\equiv$  elbow-down solution.

So C-space structure is:  $S'$



$\theta$  values & computing config.



2/11/18

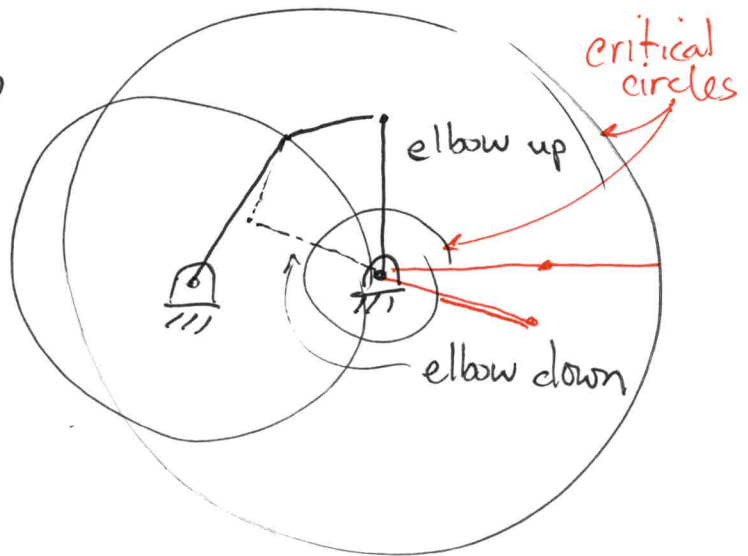
(6)

This knowledge allows your algorithm to generate motions that switch from elbow-down to elbow-up and vice versa as needed.

What's the C-space?

Two disconnected circles

$$C = S^1 \sqcup S^1$$



Show slide 18 from ClosedChains.pptx

What is C-space for a 5-bar?

In this case, you get a triple torus; 2D surface with 3 holes.

