

# **Motion Planning**

O'Rourke, Chapter 8

## **Outline**



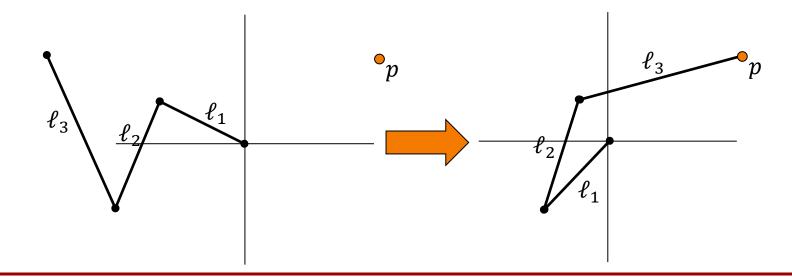
- Robot Arm
- Separability



### Goal:

Given a jointed arm, rooted at the origin, with link lengths  $L = \{\ell_1, \dots, \ell_n\}$  and given  $p \in \mathbb{R}^2$ :

- 1. Is there a configuration of joint angles for which the arm reaches p?
- 2. If there is a configuration, what is it?

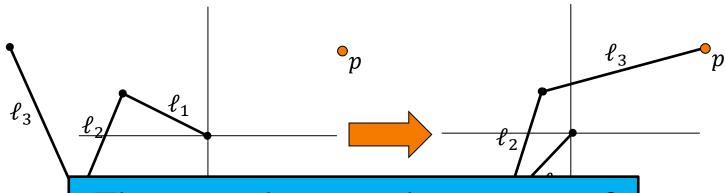




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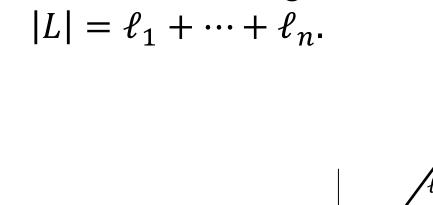


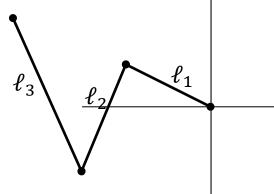
There may be more than one set of angles that has the arm reach p.



#### Notation:

Given an arm with link lengths  $L = \{\ell_1, ..., \ell_n\}$ , denote by |L| the sum of link lengths:



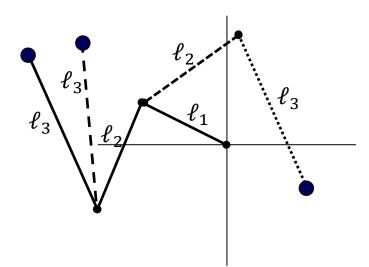






#### **Definition:**

Given an arm with link lengths  $L = \{\ell_1, ..., \ell_n\}$ , the reach of the arm is the set of points  $p \in \mathbb{R}^2$  that can be reached by some configuration of joint angles.

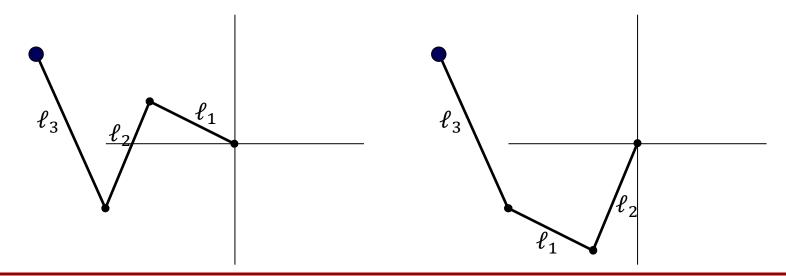




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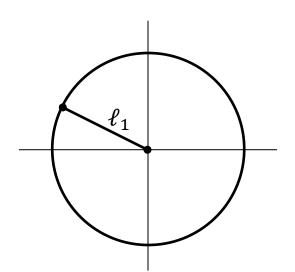
Because vector addition is commutative, the reach is independent of the order of the links.





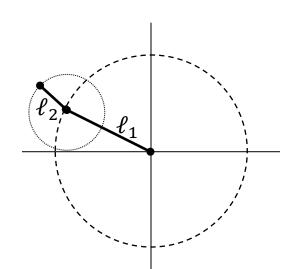
### What is the reach of an *n*-link arm?

• n = 1: A circle with radius  $\ell_1$ .



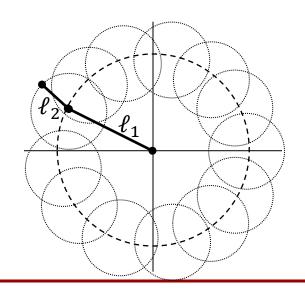


- n = 1: A circle with radius  $\ell_1$ .
- n=2: An annulus with outer radius  $r_o=\ell_1+\ell_2$  and inner radius  $r_i=|\ell_1-\ell_2|$ .



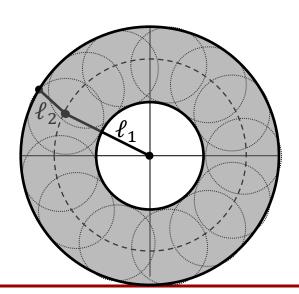


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- n=k: The Minkowski Sum of the reach of the arm with lengths  $\{\ell_1,\ldots,\ell_{k-1}\}$  and the circle with radius  $\ell_k$ .



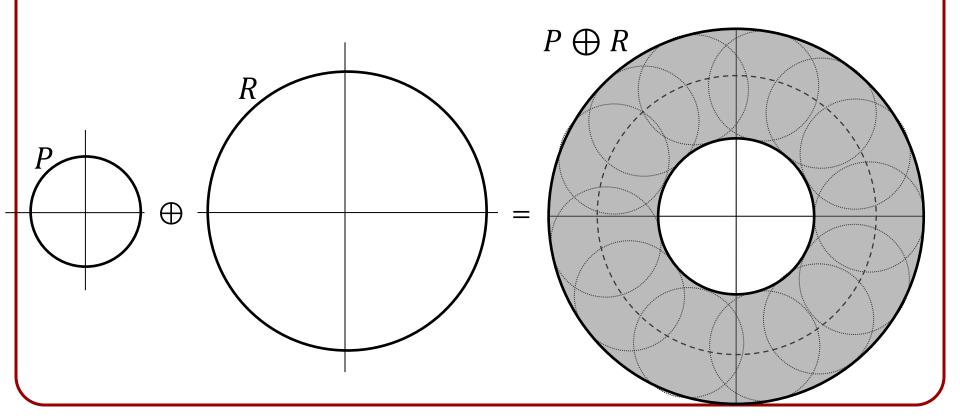
#### Claim:

The reach of an n-link arm is a (possibly degenerate) annulus.



#### Lemma:

If  $P, R \subset \mathbb{R}^2$  are path connected, then their Minkowski Sum  $P \oplus R$  is path connected.



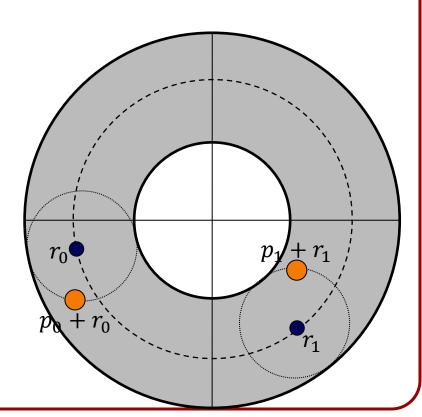


### Proof (Lemma):

Given  $p_0 + r_0, p_1 + r_1 \in P \oplus R$ , set:  $\pi: [0,1] \to P$  and  $\rho: [0,1] \to R$ 

to be the paths with:

$$\pi(0) = p_0, \, \pi(1) = p_1$$
 $\rho(0) = r_0, \, \rho(1) = r_1$ 





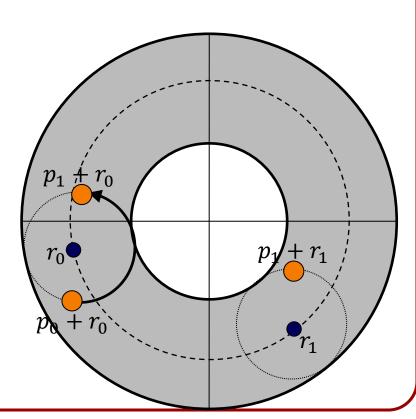
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First use  $\pi$  to travel from  $p_0 + r_0$  to  $p_1 + r_0$ .





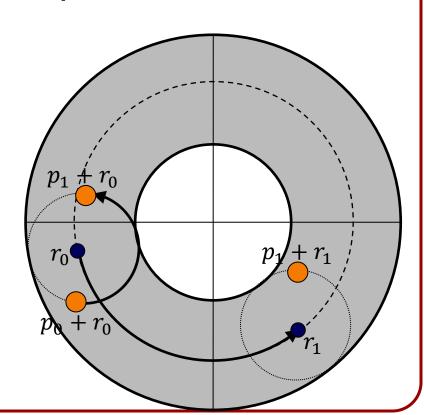
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First use  $\pi$  to travel from  $p_0 + r_0$  to  $p_1 + r_0$ . Then use  $\rho$  to travel from  $p_1 + r_0$  to  $p_1 + r_1$ .





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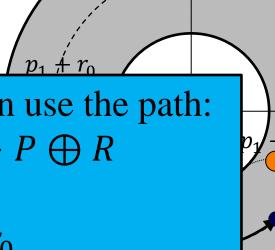
$$p_1 + r_0$$

Still more simply, we can use the path:  $(\pi + \rho)$ :  $[0,1] \rightarrow P \oplus R$ 

which satisfies:

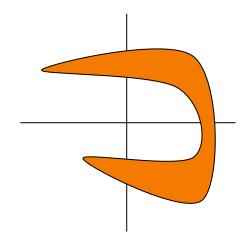
• 
$$(\pi + \rho)(0) = p_0 + r_0$$

• 
$$(\pi + \rho)(1) = p_1 + r_1$$





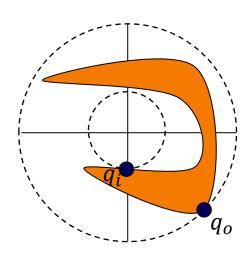
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### Proof (Claim):

Let  $q_i$  and  $q_o$  be the points in the reach which are closest/furthest from the origin.

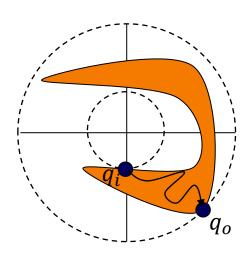




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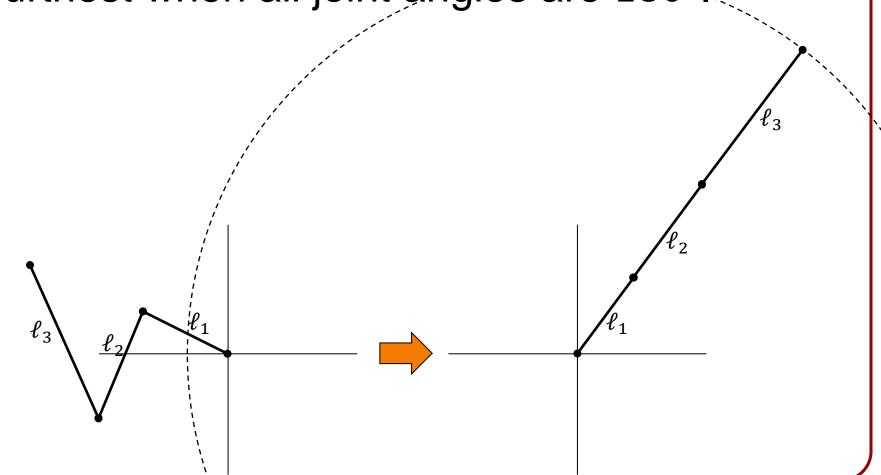
with distance d from the origin.

Since the set of reachable points is invariant to rotation about the origin, it's an annulus.

## Robot Arm (Outer Radius)



Given  $L = \{\ell_1, \dots, \ell_n\}$  the arm extends furthest when all joint angles are  $180^\circ$ .

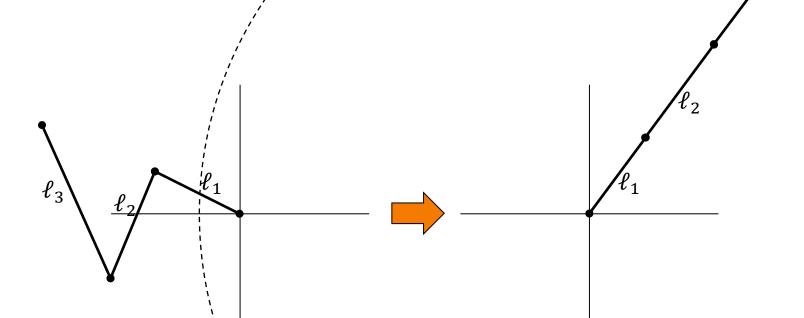


## Robot Arm (Outer Radius)



Given  $L = \{\ell_1, \dots, \ell_n\}$  the arm extends furthest when all joint angles are  $180^\circ$ .

 $\Rightarrow$  The outer radius is |L|.

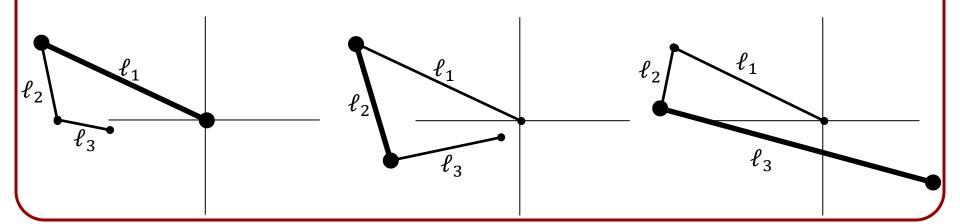




#### **Definition:**

Given link lengths  $\{\ell_1, \dots, \ell_n\}$ , the *median link* is the link  $\ell_M$  containing the mid-point:

$$\sum_{i=1}^{M-1} \ell_i \le \frac{|L|}{2} < \sum_{i=1}^{M} \ell_i$$





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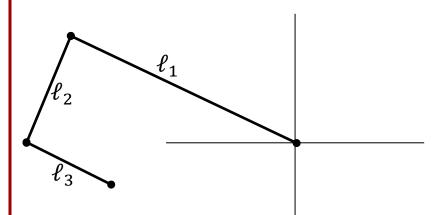
$$\sum_{i=1}^{M-1} \ell_i \le \frac{|L|}{2} < \sum_{i=1}^{M} \ell_i$$

- Either  $\ell_M > |L|/2$ .
- Or there is no link with  $\ell_k > |L|/2$  (and  $M \neq 1, n$ ).



## Case $\ell_M > |L|/2$ :

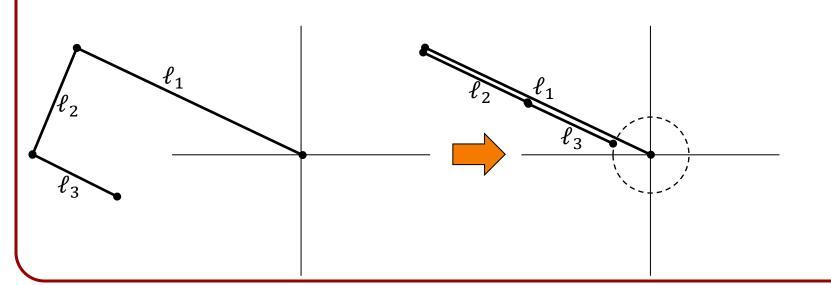
• Since the reach is independent of order, we can assume M = 1.





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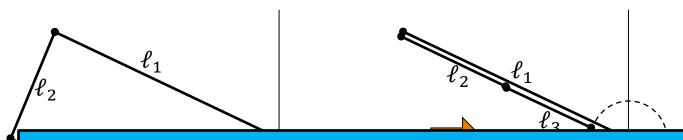
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- The inner radius is  $\ell_1 \ell_2 \cdots \ell_n$  since we can't get closer than that to the origin.





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If we don't reorder, the configuration can be obtained by:

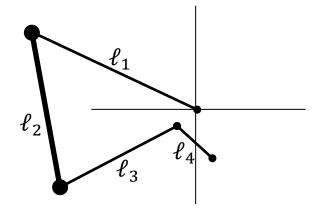
- Setting the joint angles around the median to 0°
- Setting all other joint angles to 180°.



## Case $\ell_k \leq |L|/2 \ \forall k \in [1, n]$ :

Keeping all but the joints on the median link straight, we obtain a 3-link arm with lengths:

$$\sum_{i=1}^{M-1} \ell_i = \tilde{\ell}_1, \, \ell_M = \tilde{\ell}_2, \sum_{i=M+1}^n \ell_i = \tilde{\ell}_3$$

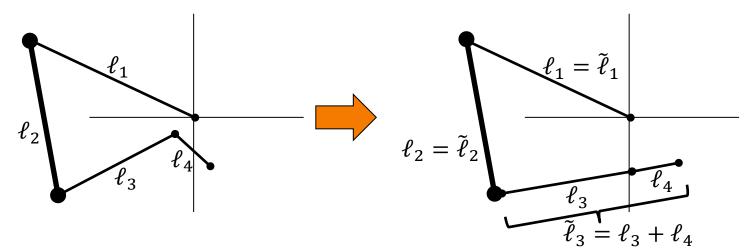




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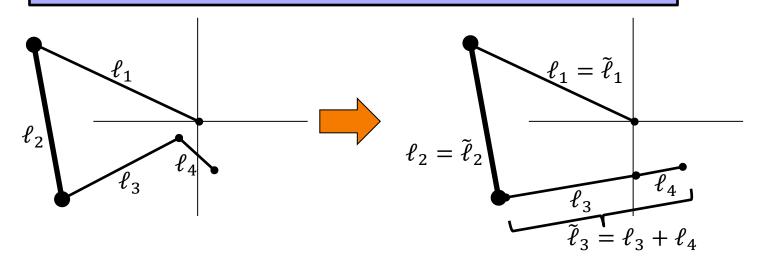


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For all distinct  $i, j, k \in \{1,2,3\}$ , we have:

$$\tilde{\ell}_i + \tilde{\ell}_j \ge \frac{|L|}{2} \ge \tilde{\ell}_k$$





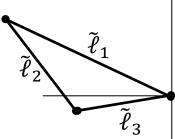
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 $\Rightarrow$  The lengths  $\tilde{\ell}_1$ ,  $\tilde{\ell}_2$ , and  $\tilde{\ell}_3$  can be realized by a triangle.



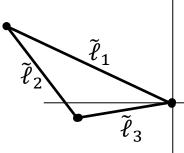


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- $\Rightarrow$  The lengths  $\tilde{\ell}_1$ ,  $\tilde{\ell}_2$ , and  $\tilde{\ell}_3$  can be realized by a triangle.
- $\Rightarrow$  The inner radius is 0.





## Case $\ell_k \leq |L|/2 \ \forall k \in [1, n]$ :

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$$\sum_{i=1}^{M-1} \ell_i = \tilde{\ell}_1, \, \ell_M = \tilde{\ell}_2, \sum_{i=M+1}^n \ell_i = \tilde{\ell}_3$$

The lengths  $\widetilde{\ell}$   $\widetilde{\ell}$  and  $\widetilde{\ell}$ 

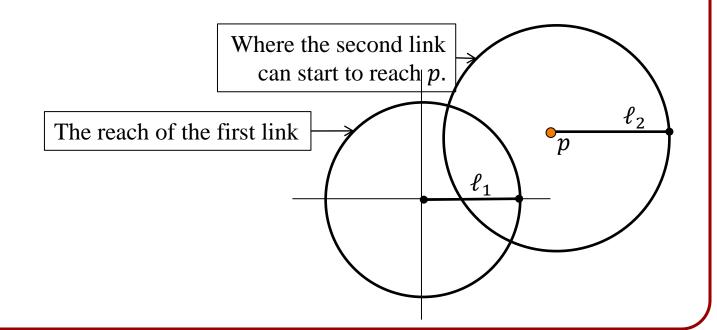
The inner and outer radii can be reached by keeping all but the joints around the median straight.

The problem of finding a reaching configuration of an *n*-link arm reduces to the problem of finding a reaching configuration of a 3-link arm.



2-link  $\{\ell_1, \ell_2\}$ :

The arm reaches  $p \in \mathbb{R}^2$  if the circle about the origin with radius  $\ell_1$  intersects the circle about p with radius  $\ell_2$ .

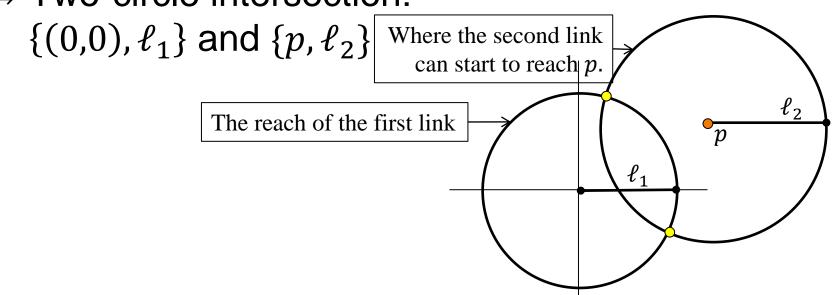




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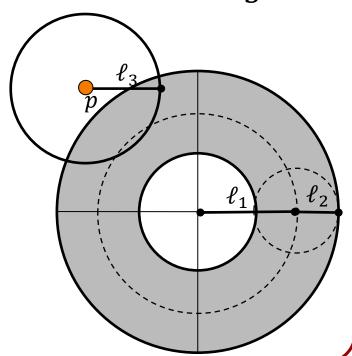
⇒ Two-circle intersection:





3-link  $\{\ell_1, \ell_2, \ell_3\}$ :

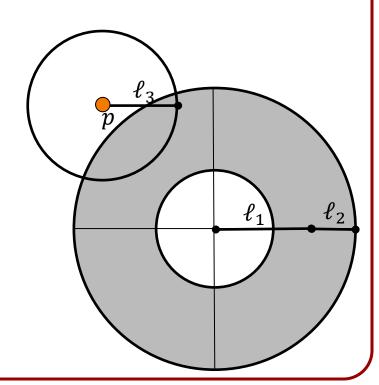
The arm reaches  $p \in \mathbb{R}^2$  if the annuls about the origin with radii  $|\ell_1 - \ell_2|$  and  $\ell_1 + \ell_2$  intersects the circle about p with radius  $\ell_3$ .





3-link  $\{\ell_1, \ell_2, \ell_3\}$ : [Case 1]

The circle about p intersects the outer radius.





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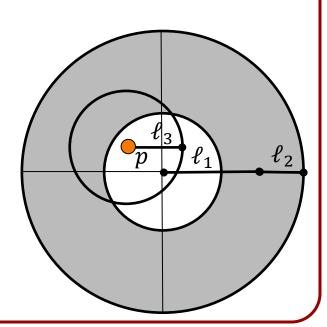
 $\Rightarrow$  Two-circle intersection:  $\{(0,0), \ell_1 + \ell_2\}$  and  $\{p, \ell_3\}$ 

$$\ell_3$$
 $\ell_1$ 
 $\ell_2$ 



3-link  $\{\ell_1, \ell_2, \ell_3\}$ : [Case 2]

The circle about p intersects the inner radius.

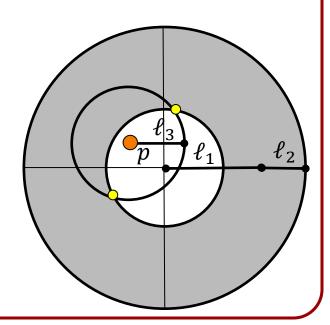




3-link  $\{\ell_1, \ell_2, \ell_3\}$ : [Case 2]

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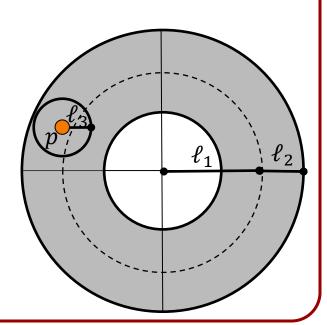
 $\Rightarrow$  Two-circle intersection:  $\{(0,0), |\ell_1 - \ell_2|\}$  and  $\{p, \ell_3\}$ 





3-link  $\{\ell_1, \ell_2, \ell_3\}$ : [Case 3a]

The circle about p does not intersect either boundary and doesn't contain the origin.





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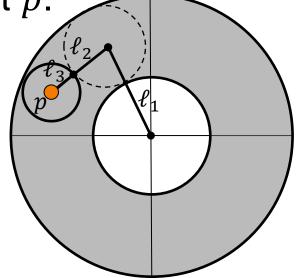
 $\Rightarrow$  There is a circle with radius  $\ell_2$  centered on a point on the circle about the origin with radius  $\ell_1$  that is tangent to the circle about p.



3-link  $\{\ell_1, \ell_2, \ell_3\}$ : [Case 3a]

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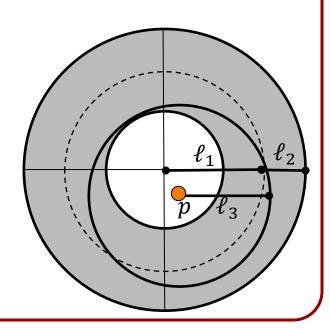
- $\Rightarrow$  There is a circle with radius  $\ell_2$  centered on a point on the circle about the origin with radius  $\ell_1$  that is tangent to the circle about p.
- $\Rightarrow$  Two-circle intersection:  $\{(0,0), \ell_1\}$  and  $\{p, \ell_2 + \ell_3\}$





3-link  $\{\ell_1, \ell_2, \ell_3\}$ : [Case 3b]

The circle about p does not intersect either boundary and contains the origin.





3-link  $\{\ell_1, \ell_2, \ell_3\}$ : [Case 3b]

The circle about p does not intersect either boundary and contains the origin.

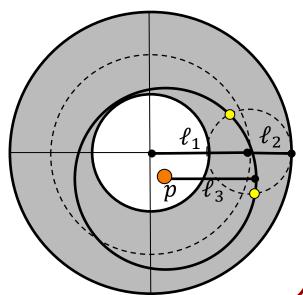
 $\Rightarrow$  The circle with radius  $\ell_2$  centered on any point on the circle about the origin with radius  $\ell_1$  intersects the circle about p.



3-link  $\{\ell_1, \ell_2, \ell_3\}$ : [Case 3b]

The circle about p does not intersect either boundary and contains the origin.

- $\Rightarrow$  The circle with radius  $\ell_2$  centered on any point on the circle about the origin with radius  $\ell_1$  intersects the circle about p.
- $\Rightarrow$  Two-circle intersection:  $\{(|\ell_1|, 0), \ell_2\}$  and  $\{p, \ell_3\}$



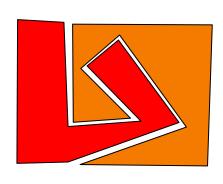
# **Outline**



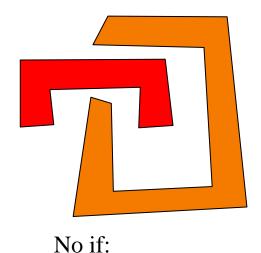
- Robot Arm
- Separability



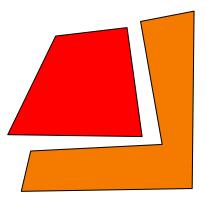
#### Are these polygons separable?



No



• Translations only

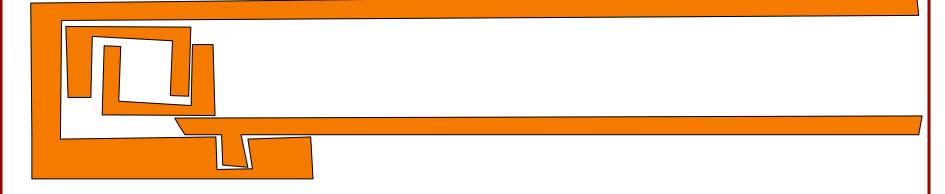


No if:

- Translations only
- Along a fixed direction

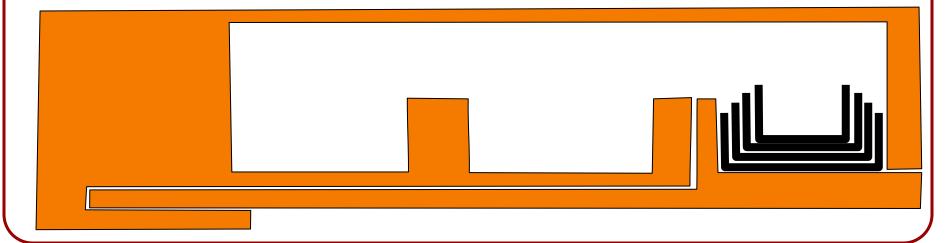


Are these polygons easily separable?



#### No if:

Polygons are constrained to move one at a time

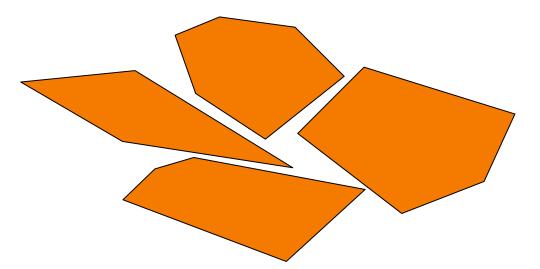




#### Convex Polygons [Guibas and Yao, 1983]

Given a set of convex polygons, the polygons can be translated arbitrarily far (w/o loss of generality) to the right, without crossing, by:

- applying a single translation to each polygon
- applying the translations one at a time

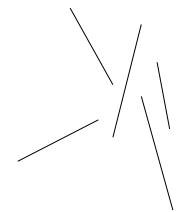




#### Lemma:

Given a set of (non-intersecting) line segments, the segments can be translated arbitrarily far (w/o loss of generality) to the right, without crossing, by:

- applying a single translation to each line segment
- applying the translations one at a time

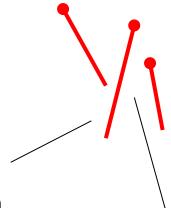




#### Proof (Lemma):

Identify the set of segments *L* whose top vertex is unobstructed from the right.\*

 Note that the line segment with highest (right-most) vertex must be in this set.



\*e.g. In  $O(n \log n)$  time, for example, with the sweep-line algorithm.

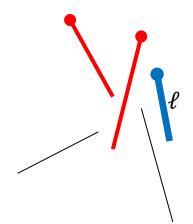


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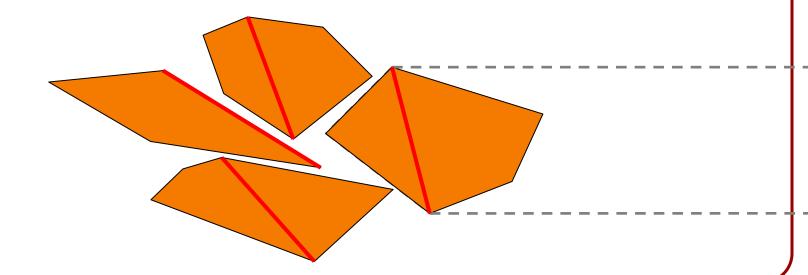
 $\ell$  did not have the lowest top vertex.



#### Proof:

Apply the Lemma to the line segments connecting the (vertically) extremal vertices of the polygons.

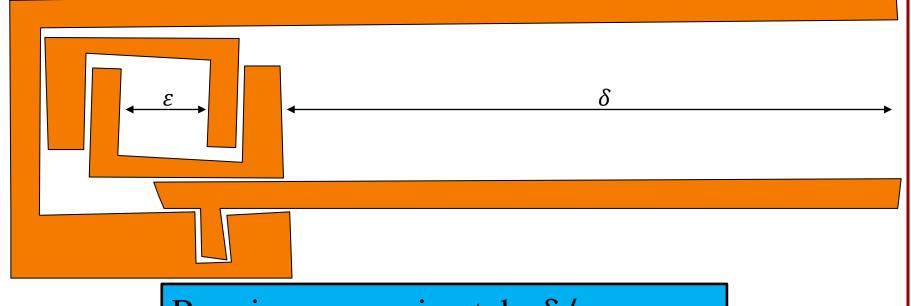
 The sweep of the first line segment, unioned with the associated polygon, contains the right translation of the polygon and is empty of all others.





#### Why This is Hard [Take 1]:

There are configurations of polygons of constant size that require arbitrarily many moves:



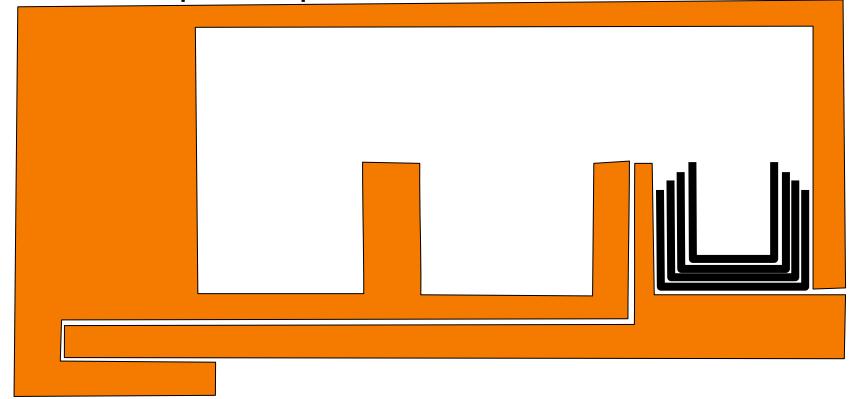
Requires approximately  $\delta/\varepsilon$  moves.

But, this only requires on the order of  $\delta$  "work".



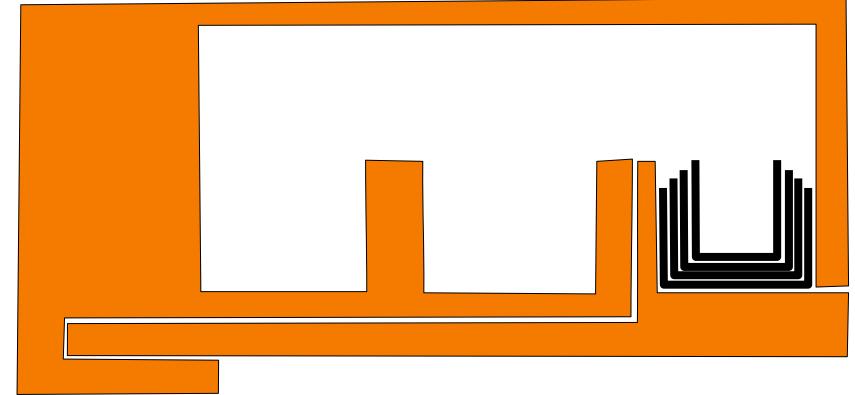
Why This is Hard [Take 2]:

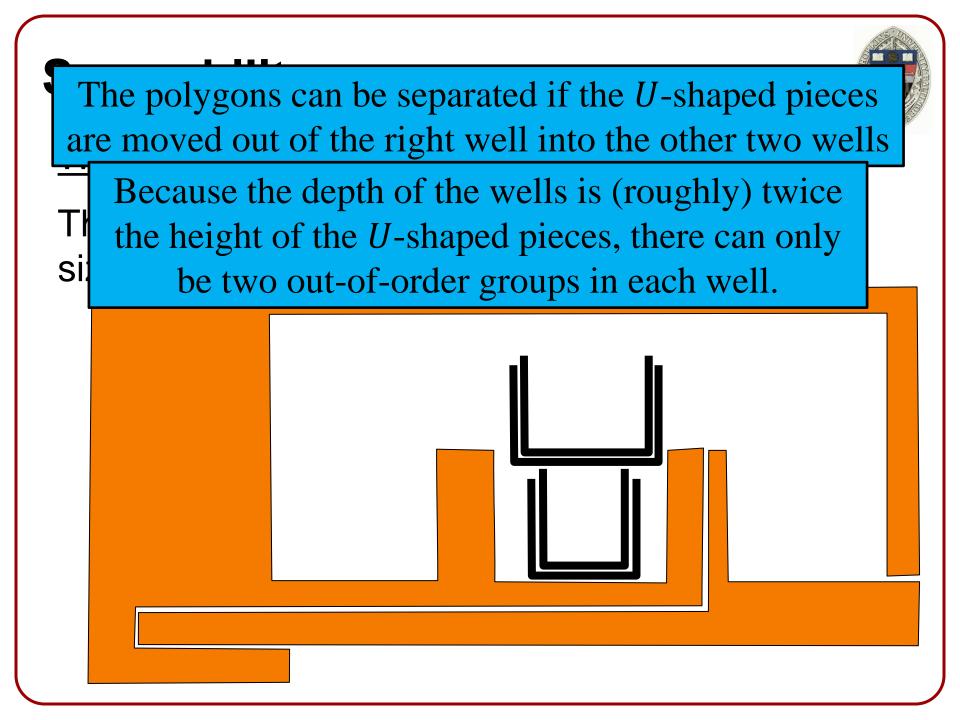
There are configurations of polygons of constant size that require exponential amount of work:

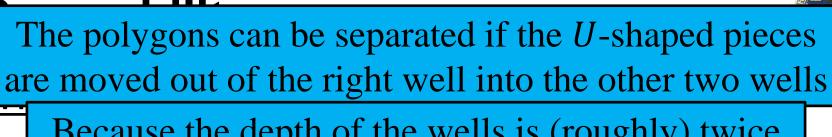


The polygons can be separated if the U-shaped pieces are moved out of the right well into the other two wells

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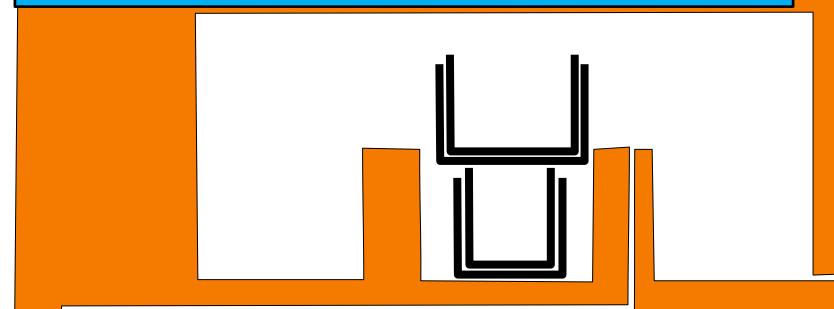






Because the depth of the wells is (roughly) twice the height of the *U*-shaped pieces, there can only be two out-of-order groups in each well.

Si



Similar to the "Towers of Hanoi" problem, this can be shown to require an exponential number of moves.

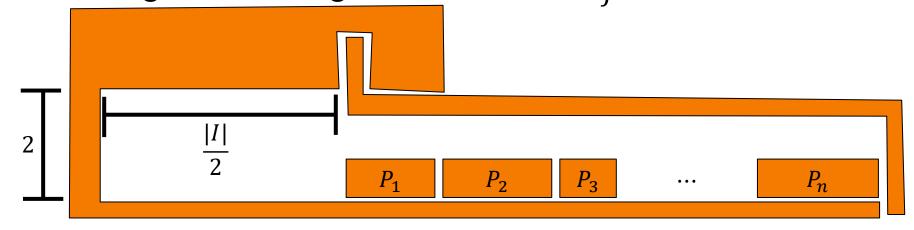


#### Why This is Hard [Theoretically]:

Given a set of positive integers  $I = \{i_1, ..., i_n\}$ , set:

$$|I| = i_1 + \dots + i_n$$

and build the following configuration, where  $P_j$  is a rectangle with height 1 and width  $i_i$ :



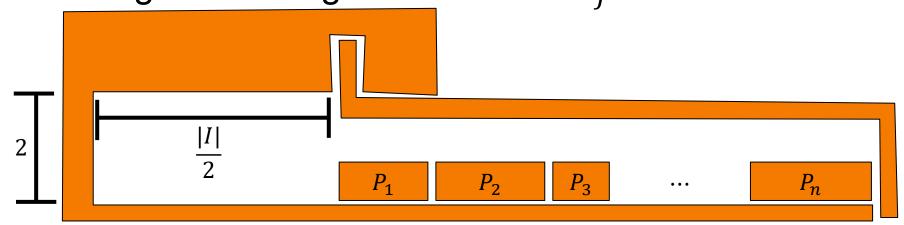


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The pieces are separable iff. we can partition I into two subsets whose sums are equal (to |I|/2).



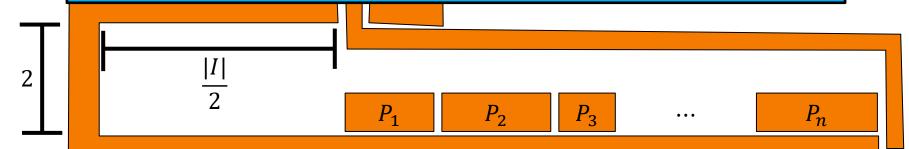
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The partitioning problem is know to be *NP*-hard.



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