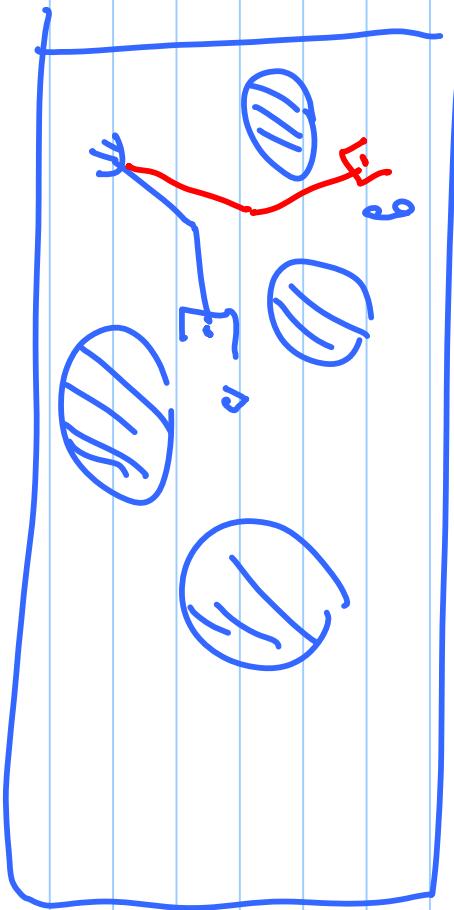


## Lecture 2

**precise**

Q : How difficult (complex) is  
the path planning problem?



## Background:

How do we measure complexity of a "problem"

Two steps

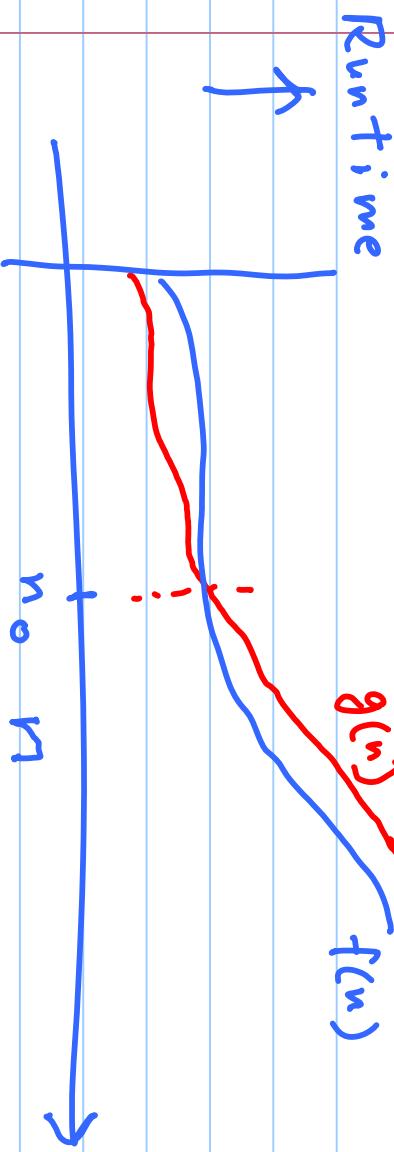
- 1) Complexity of an algorithms
- 2) Complexity of a problem is measured by the "best" known (unknown) algorithm that can solve it.

i) Complexity (Run time) of an algorithm : Big "O" notation

Def :  $f(n) = O(g(n))$  ; if  $\exists$

$c, n_0 > 0$  such that

$$f(n) \leq c |g(n)| \quad \forall n > n_0$$



$$f(n) = 5n^2 + \underbrace{3n + \log(n)}$$

$$g(n) = n^2$$

$$\Rightarrow O(f(n)) = O(n^2)$$

Simple example: Sorting numbers

INPUT:  $A[1:n]$  is given (array of #n)

$$\left[ a_1, a_2, \dots, a_n \right]$$

Prob: arrange them  $\#n$  in descending

or else

for  $i \leftarrow 1, n$

for  $j \leftarrow i, n$

if  $A[i] < A[j]$

$$f(n) = \underline{\underline{O(n^2)}}$$
$$(3+1)n^2$$
$$\quad\quad\quad \text{swap } A[i] + A[j]$$

$A[i] = A[j]$

$A[j] = A[i]$

$A[i] = \text{temp}$

end if

end for

end for

Two classes of problems

why?

① ↘

best known alg

are exponential

are polynomial in  $n$

in  $n$

$O(n^k)$   $k$  is known

② ↘

$O(2^n)$

P

run time increases

drastically as

a func. of  $n$

even for low values of  $n$

( $10 - 100$ ), run time can

be come quite large (days)

Ex: unit op. (assignment, addition)  
in say 1 msec.

$$n = 10 \quad 2^{10} \rightarrow 1.024 \text{ sec}$$

$$= 18 \quad 2^8 \cdot 2^{10} \rightarrow 256 \text{ sec}$$

$$= 2.6 \quad 2^8 \cdot 2^{18} = 256 \times 256 \text{ sec}$$

$$\approx 15 \text{ hrs}$$

Examples of class ② :

(a) Set partition      (b) Boolean Satisfiability

a) Given a set  $S = \{l_1, l_2, \dots, l_n\}$  of  $n$  numbers. Can the set be

partitioned into two disjoint subsets

$$S_1 + S_2 := S_1 \cup S_2 = S$$

$$S_1 \cap S_2 = \emptyset$$

$$\sum_{l_i \in S_1} l_i = \sum_{l_j \in S_2} l_j$$

b) Given  $n$  literals  $x_i$ ,  $i=1, n$

$$x_i \in \{0, 1\}$$

Boolean Sentence:

$$\bigwedge_{i=1}^k c_i$$

CNF

clauses  $\rightarrow c_i = \bigvee x_j (i)$

$$c_1 = (x_1 \vee x_2 \vee \bar{x}_3)$$

Prob.: Does  $\exists$  an assignment of  
-----  
literals  $x_i$  such that

the Boolean sentence is true.

"polynomial unsatisfiability": if a

"solution" in proposed, one can

(certificate)

verify if it is true or not

in polynomial time.

imagine we can have arbitrarily large

special parallelism implemented:

machine

mc 1

mc 2

mc 8

$x_1 \ x_2 \ x_3$

0 0 0

0 0 1

0 1 0

0

?



Non-deterministic mfc :

Boolean satisfiability  
runs in poly time

NP problems

Non-deterministic poly

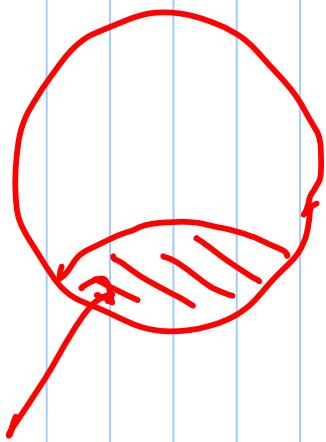
P

$P \subseteq NP$

$NP \subseteq?$   
P

Open Q in CS.

NP



"Cook's theorem"

"harder problems  
in NP"

Notion of "polynomial reducibility":

Let  $L_1$  +  $L_2$  be two problems.

$L_1 \propto L_2$  or ( $L_1$  reduces to  $L_2$ )

iff there is a way to solve  $\underline{L_1}$

$L_1$  by a deterministic polynomial algorithm

using a deterministic alg. that

solves  $L_2$  in polynomial time.

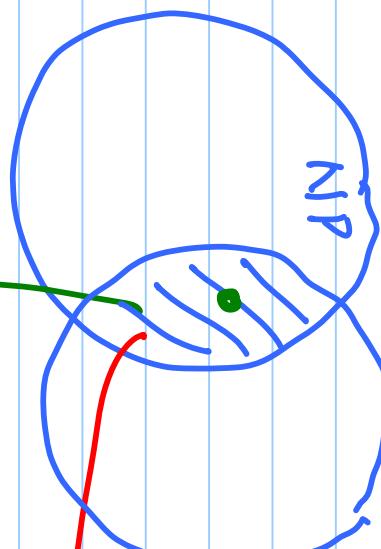
$\Rightarrow L_2$  is at least as hard as  $L_1$

"Cook showed that Boolean Satisfiability

is the hardest problem in NP"

NP

NP-hard



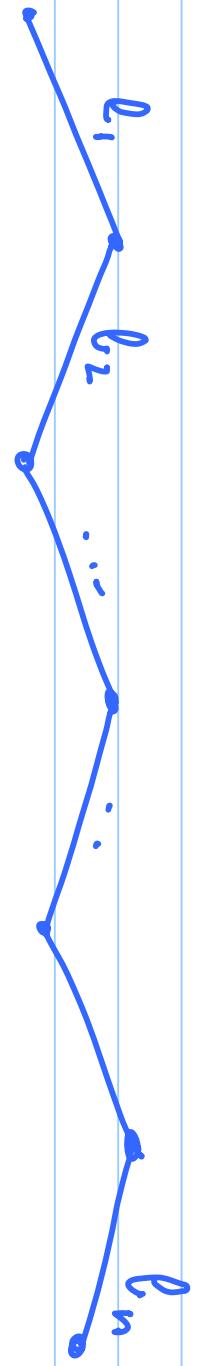
→ Rule finding

NP-hard: if  $SAT \leq L$  then

$L$  is NP-hard

NP-complete

Ruler folding problem:



Given thin ruler, and a +ve integer  $k$ .

Prob: Can thin ruler be folded in

length  $H \leq k$ ?

NP - complete !!

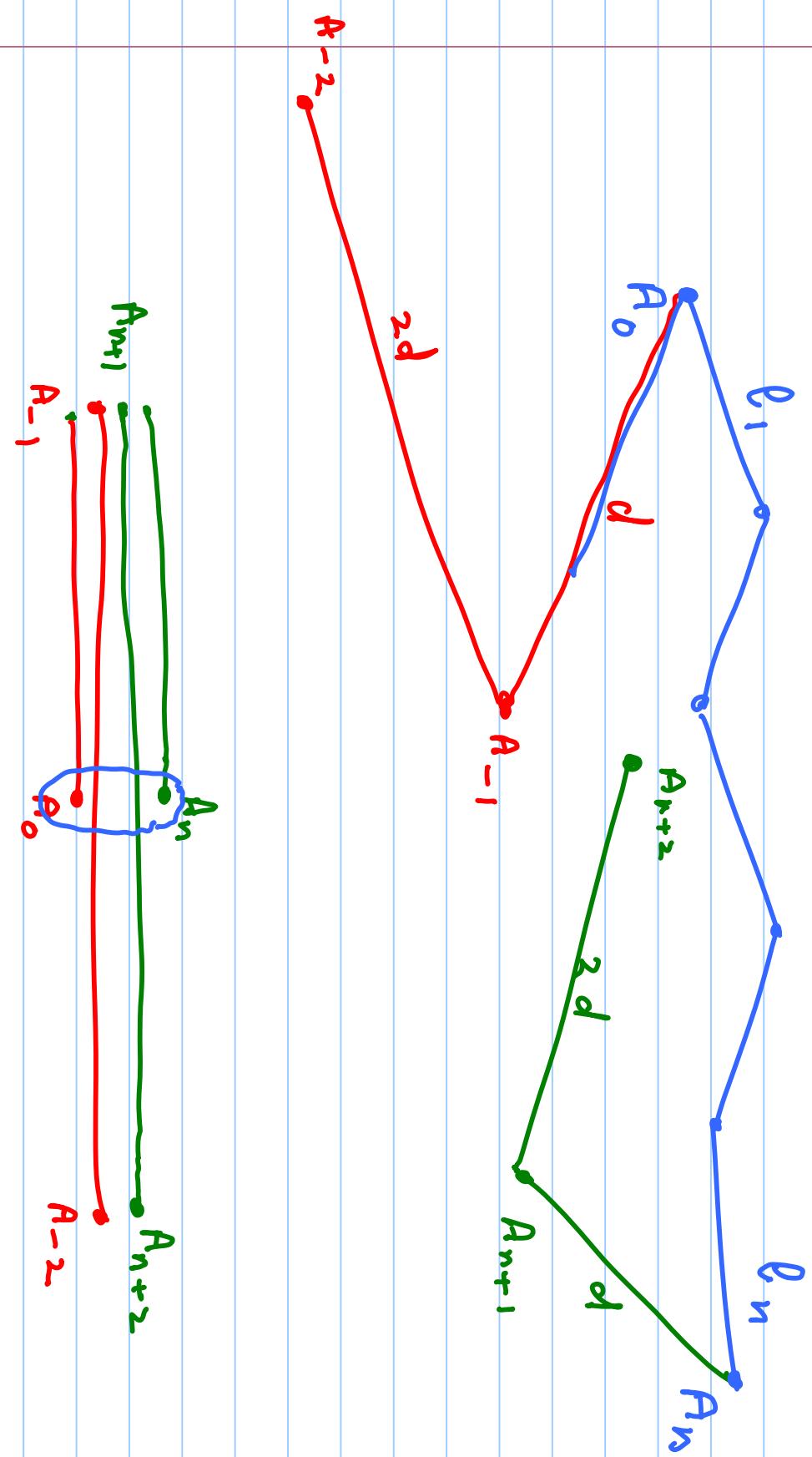
Set Partitioning or ~~Rule~~ Rule folding

$$S = \{ \ell_1, \dots, \ell_n \}$$

find  $S_1, S_2 : S_1 \cup S_2 = S$   
 $S_1 \cap S_2 = \emptyset$

$$\sum_{\ell_i \in S_1} \ell_i = \sum_{\ell_j \in S_2} \ell_j$$

Rules Construction:  $\sum_{\ell_i \in S} \ell_i = d$



$\Rightarrow$  Ruler folding problem comp. in  
exponentiation in the # of lines of  
the ruler

[1992]?

$\longrightarrow$  Canny & Reif  $\longrightarrow$  moving obstacles  
problem

NP-hard  $\leftrightarrow$  exponential in in  
# of obstacles

Schwarzkopf + Sharir [1981]:

exponentials in # of  
links of the robot

1) geometric variable : Captures the  
environment complexity

2) # of links / degrees of freedom in  
the robot → Captures Complexity  
of the robot