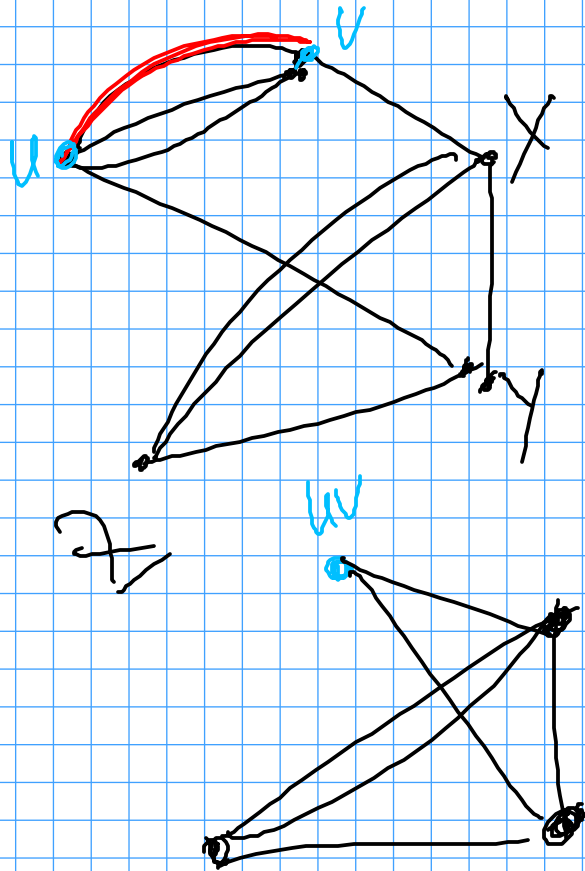


# MIN CUT



edge contraction  
 $O(n)$

	u	v	x	y	z
u	0	3	0	1	0
v	3	0	1	0	0
x	0	1	0	1	2
y	1	0	1	0	1
z	0	0	2	1	0

adjacency matrix

	$v_1$	$v_2$	$v_3$	$v_4$	$v_5$	
$v_1$	0	0	1	4	2	7
$v_2$	0	0	5	1	1	7
$v_3$	1	5	0	0	3	9
$v_4$	4	1	0	0	1	6
$v_5$	2	1	3	1	0	7
	7	9	6	7		36

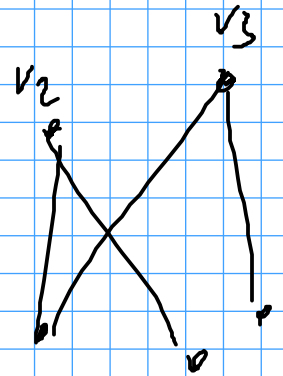
$7$   
 $14$   
 $23$   
 ← ← ←  
 dice: 18

$O(n)$  to select the entry

$$\Downarrow$$

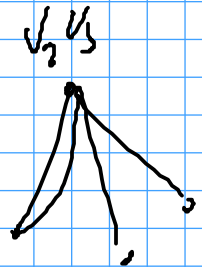
	$v_1$	$v_2$	$v_3$	$v_4$	$v_5$	
$v_1$	0	0	1	4	2	7
$v_2$	0	0	0	1	1	2
$v_3$	1	0	0	0	3	4
$v_4$	4	1	0	0	1	6
$v_5$	2	1	3	1	0	7
	7	2	4	6	7	26

$O(n^2)$



$\Downarrow$

	$v_1$	$v_2 v_3$	$v_4$	$v_5$	
$v_1$	0	1	4	2	7
$v_2 v_3$	1	0	1	4	6
$v_4$	4	1	0	1	6
$v_5$	2	4	1	0	7
	7	6	6	7	26



$O(n)$

$$O(2^k \cdot k \cdot m)$$

for finding a colourful path

w @ i+1

↳ look at all neighbors  
 $O(k)$

↳ for each v with  $\{v_1, \dots, v_k\}$

↳ look at all S

colored sets of length i  $\binom{k}{i}$

↳ look if color of v fits in, if yes, create new label

i per color set

total cost:

$$\sum_{i=1}^k \binom{k}{i} O(i) = O\left(m \sum_{i=1}^k k^i i\right) = O(m 2^k k)$$

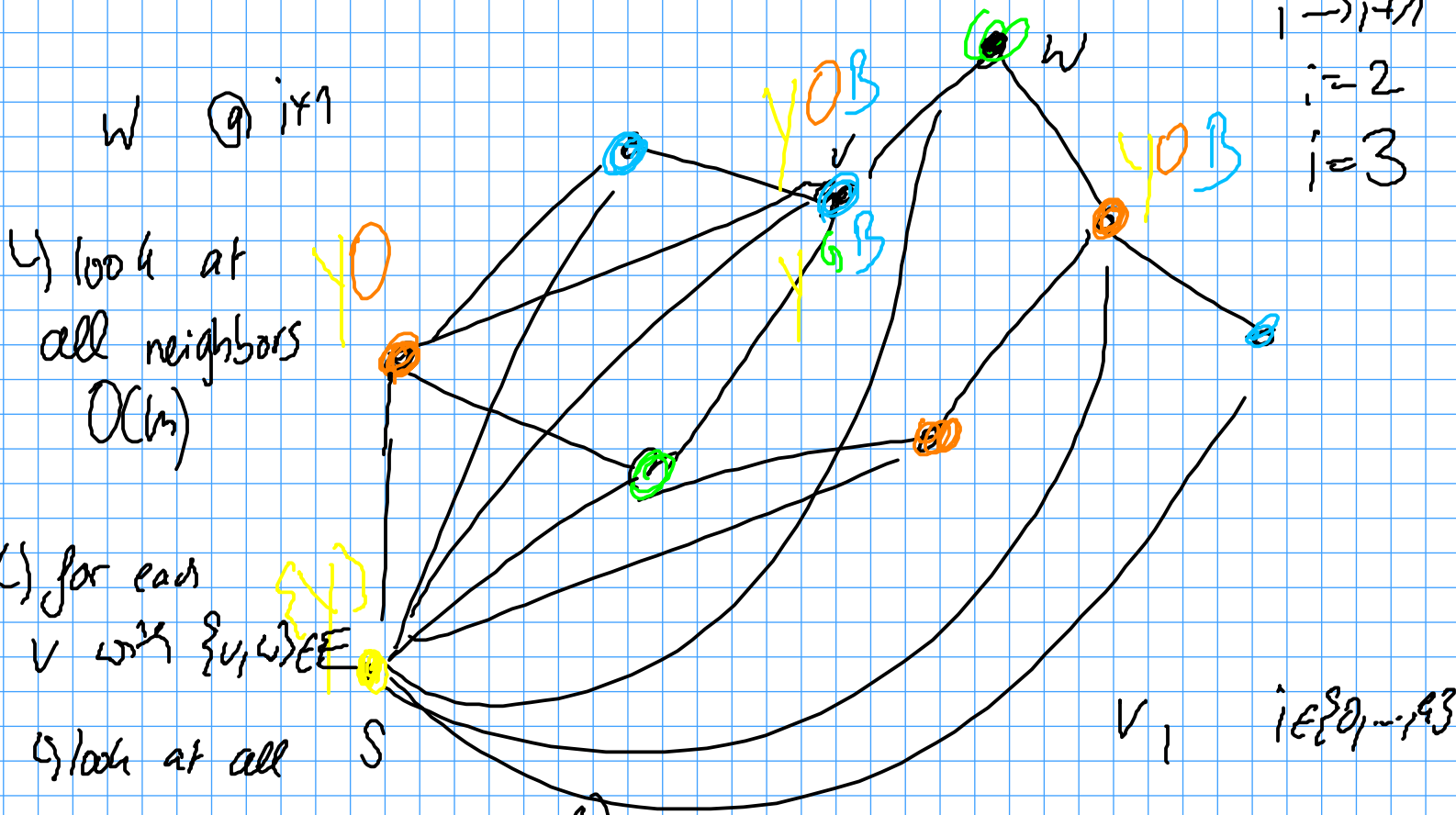
Y O B G

Y O B

Y G B

Y O B

i → i+1  
i = 2  
i = 3



Colour sets of v are color on a path of length i from S to v which could be a prefix of a colourful path

# RANDOMIZATION IN GAMES & AI

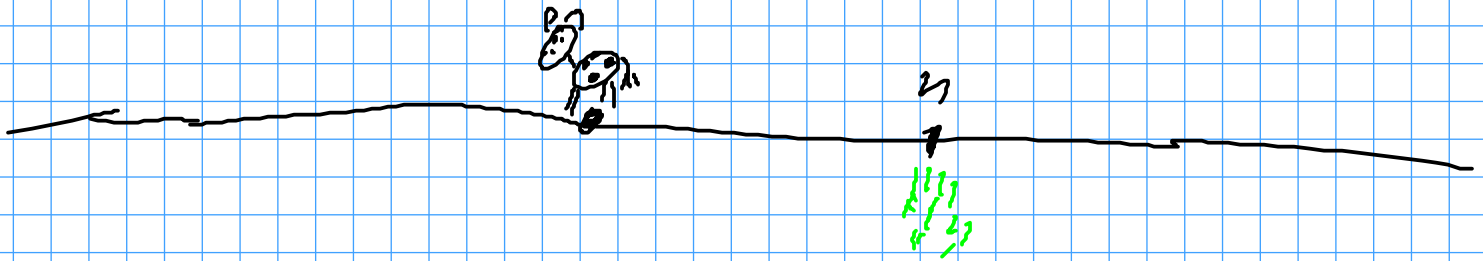


## COW PATH PROBLEM

- Liese needs grass. Liese stands at a crossroad with  $w$  lanes. There is grass at only one lane at distance  $n$ . Liese only sees the grass if she

Stands right on it.

↳ Simplified version:  $U=2$



If Lisa could know  $n$ , she should walk  $n$  in one direction, if there is no goal  $2n$  in the other direction.

Total walk distance  $\leq 3n$

↳ at most a factor of 3 of walking overhead

↳ expected walking distance if she chooses the initial direction u.a.r.

$$E(X) = \frac{1}{2}3n + \frac{1}{2}n = 2n$$

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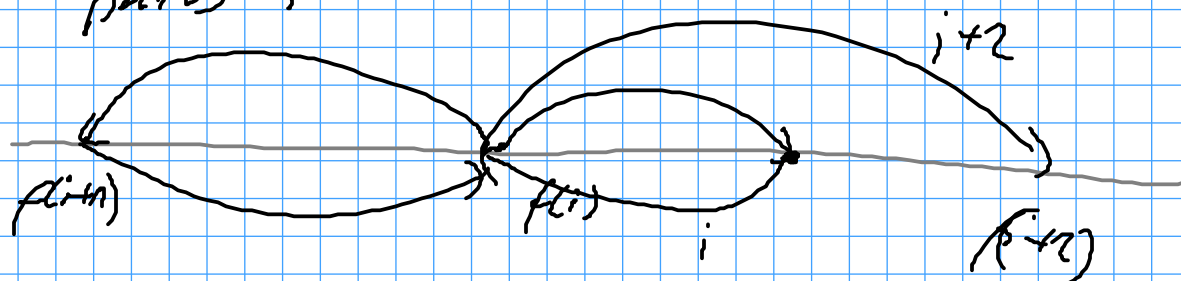
Def: Competitive ratio  $c$ , tells how good an algorithm is compared to an optimal strategy with the whole environment known a priori.

Exp. comp. ratio

how good a rand. alg. is  
expectedly ...

↳ Now: Lisa is not aware of  $n$ .

Solution has to involve alternating the  
paths!



in round  $i$  Lisa walks  $f(i)$  steps  
in one direction, if she does not find  
grass she returns to the starting point  
and walks  $f(i+1)$  steps in the next  
round in the other direction

$$\forall i \geq 3 : f(i) > f(i-2)$$

$$f(i) = i$$

$$\sum_{i=1}^n 2i = 2 \frac{n(n+1)}{2} \in O(n^2)$$

$$f(i) = 2^i$$

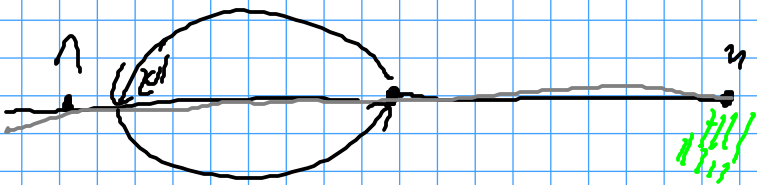
Lemma: For  $f(i) = 2^i$  the competitive ratio of the algorithm is 9.

Proof: Let  $j$  be the index such that  $2^j < n < 2^{j+1}$  ( $j+1 = \lceil \log_2 n \rceil$ )

In the worst case Lise walks in the wrong direction in round  $j+1$ .

Therefore

$$\# \text{ steps} \leq \sum_{i=1}^{j+1} 2^i + n = \sum_{i=1}^{j+1} 2^i + n$$



$$= 2(2^{j+2} - 1) + n$$

$$= 2^{j+3} - 2 + n$$

$$= 2^3 \cdot 2^j - 2 + n$$

$$\leq 8n - 2 + n < 9n$$

Comp. ratio of 9, as god can  
needs to walk  $n$  //

What about randomly choosing the initial direction?

Good case:

$$\# \text{ steps} = \sum_{i=1}^j 22^i + n = 2^{j+2} - 2 + n$$

$$\leq 4n - 2 + n < 5n$$

Expected walk distance  $\approx \frac{1}{2} 9n + \frac{1}{2} 5n$   
 $\approx 7n$

Smart (or) Algorithm (general # of lines  $w$ )

1. choose a random permutation of the  $w$  lines, perm. of  $\{0, \dots, w-1\}$
2.  $\epsilon \leftarrow \text{u.a.v. } [0, 1)$ , some constant  $r > 1$  (fixed)
3.  $d \leftarrow r^\epsilon$  (initial distance)
4.  $p \leftarrow 0$
5. repeat
  - explore path  $\sigma(p)$  up to distance  $d$
  - if no grass was found, go



- back to the origin
- $d \leftarrow d \cdot r$
- $p \leftarrow (p \cdot r) \bmod w$

until Lisee is happy

Theorem: For any fixed  $r > 1$ , the Smart Cow algorithm has a comp. ratio of  $R(r, w)$

$$= 1 + \frac{2}{w} \cdot \frac{1 + r + r^2 + \dots + r^{w-1}}{w \cdot r}$$

Remark: Smart Cow is optimal, because there is a matching lower bound

Exercise: Implement the naive alg. for  $w$  lines and Smart Cow. Compare results.

Overview of comp. ratios in dep. of  $w$  for Smart Cow

$w=2$       4.59      ( $r=3.59$ )

$w=3$       2.73      ( $r=2.01$ )

opt det. ratio

9 EXERCISE

14.5 why?

U=7

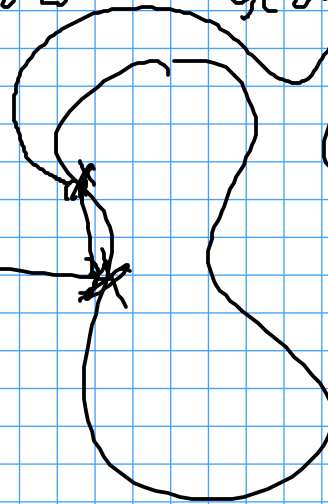
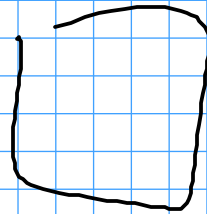
20.13 (v=1.28)

36.3

## Robot in Unknown Geometric Terrain



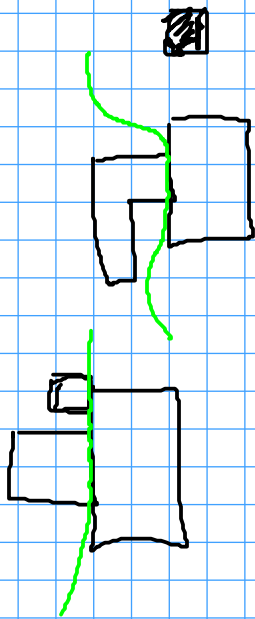
s



Robot at source point  $s \in \mathbb{R}^2$ , know target  $t \in \mathbb{R}^2$ . But completely unknown environment. Goal: Find a strategy with a good competitive ratio compared to the optimal path when all obstacles are known a priori.

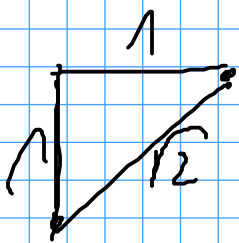
### ASSumptions:

- obstacles are opaque, impenetrable and non-overlapping
- no obstacle contains  $s$  or  $t$  or encloses it

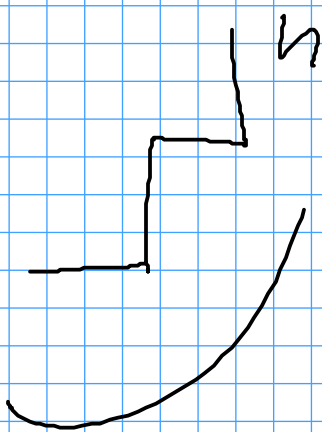


- the unit square can be inscribed in every obstacle
- if two obstacles touch, the robot can 'squeeze' between them, and obstacles are convex, then no non-convex obstacles can be build by combination

↳ also allow for the target to be a polygon or an infinite well



- robot only can explore obstacles by bumping into them



↳ Euclidean distance between  $S$  and  $E$ ,  $p$  lengths of the paths taken by the robot. We would like to minimize  $\frac{p}{n}$ .

If we restrict robot movements to left/right and up/down one only loses a factor of  $\sqrt{2}$ .