

# ANTS on a Plane

Jared Saia

Joint with Abhinav Aggarwal

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# ANTS problem

**N** agents start at node (*nest*) on infinite grid

*Target* is placed on node at distance **L**

**Goal:** Find the target ASAP

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Synchronous agents; no communication

*Advice:* bits to encode #agents, roles, etc

# ANTS Results

$N$  agents start at node (*nest*) on infinite grid

Target is placed on node at distance  $L$

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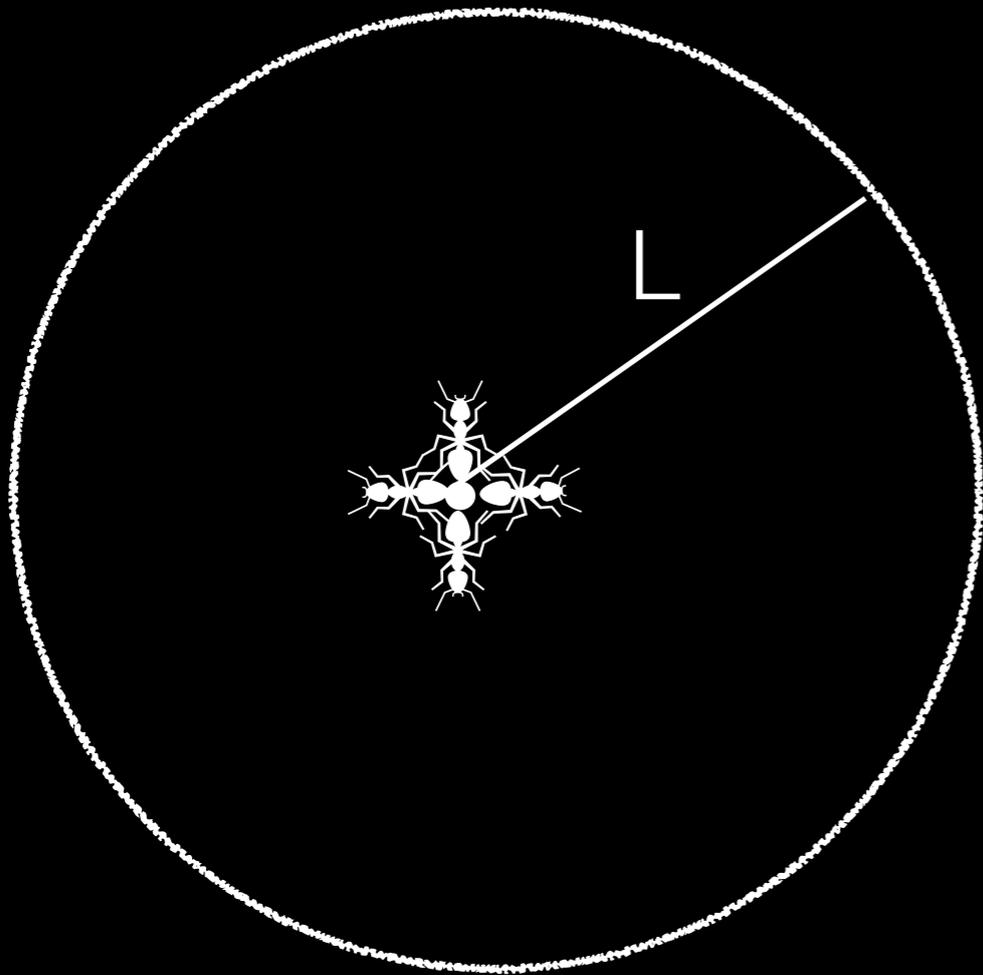
Target is placed on node at distance  $L$

*Advice*: bits to encode #agents, roles, etc

$O(L + L^2/N)$  time with  $O(\log \log N)$  bits advice

$O((L + L^2/N)\log^{1+\epsilon} N)$  time with no advice, for any fixed  $\epsilon > 0$

# $O(L + L^2/N)$ is Optimal



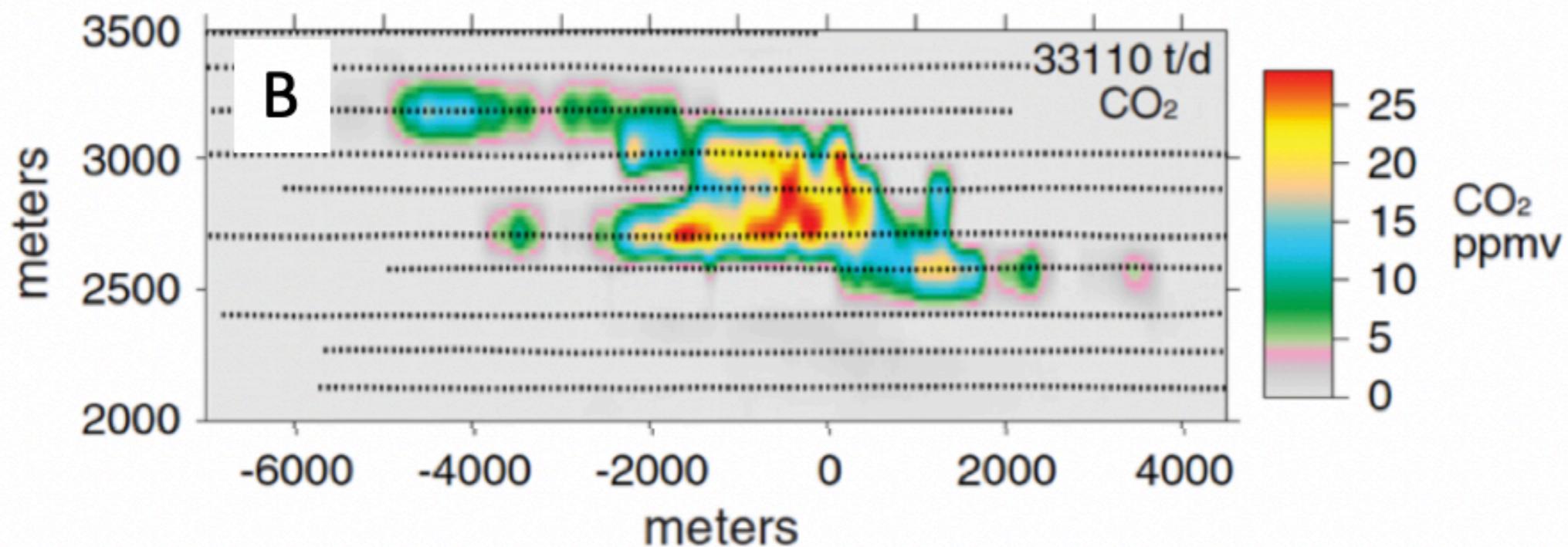
Area to Search  $\approx L^2$

$N$  agents

Need  $\approx L^2/N$  to search area

Plus  $L$  time to reach target

# Motivation: Drones seek $CO_2$



Melanie Moses

[moseslab.cs.unm.edu](http://moseslab.cs.unm.edu)

Use grid to approximate plane?

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Problems:

Choosing grid granularity

Too low: May miss target

Too high: Computational load on agents

Hard to handle different target shapes

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Solution: Formulate problem on Euclidean plane

# Target Shape

What target shape can we handle?

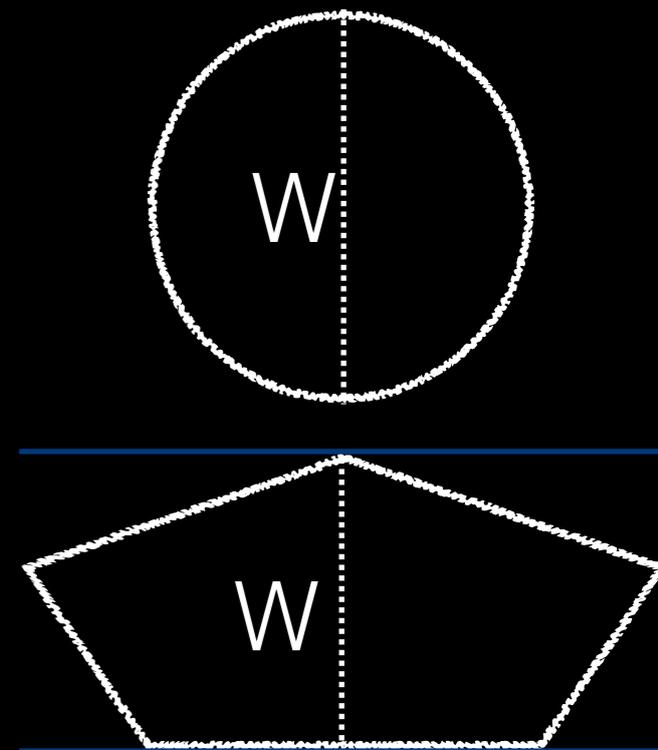
# Target Shape

What target shape can we handle?

A convex shape

Width: Smallest distance between two parallel lines touching boundary but not interior

$L$  is distance to segment  $W$ . Assume  $W \leq L$ .



# Our Result - No Advice

$$O\left(\left(L + \left(\frac{L^2}{NW}\right)\right) \log L\right) \text{ search time}$$

[F&K '15]  $O((L + L^2/N)\log^{1+\epsilon} N)$  time, for any  $\epsilon > 0$

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If  $t < N$  agents removed by adversary

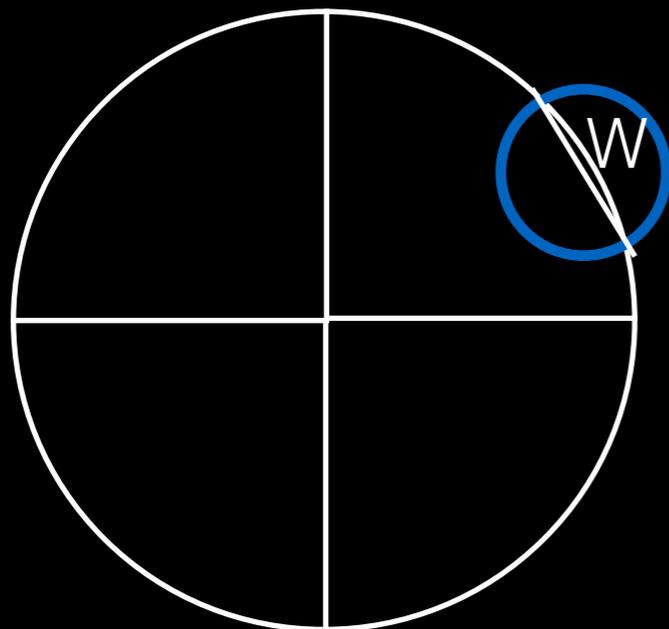
$$O\left(\left(L + \frac{L^2(t+1)}{NW}\right) \log L\right) \text{ search time}$$

# Spokes

*Spoke*: line segment from nest and back

Say target is on circle of circumference 1

How many spokes are needed to find it?

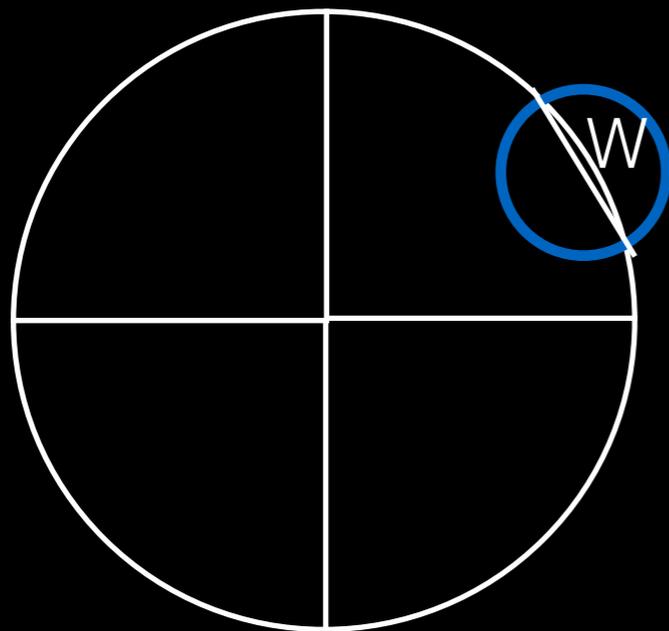


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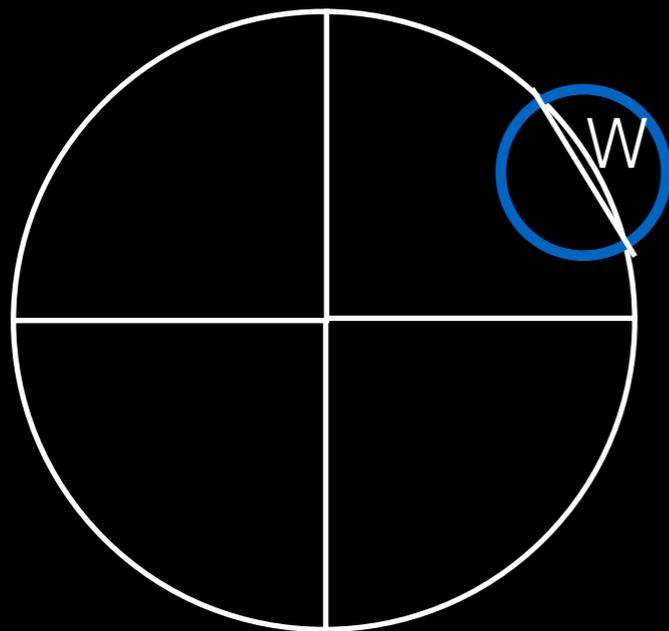
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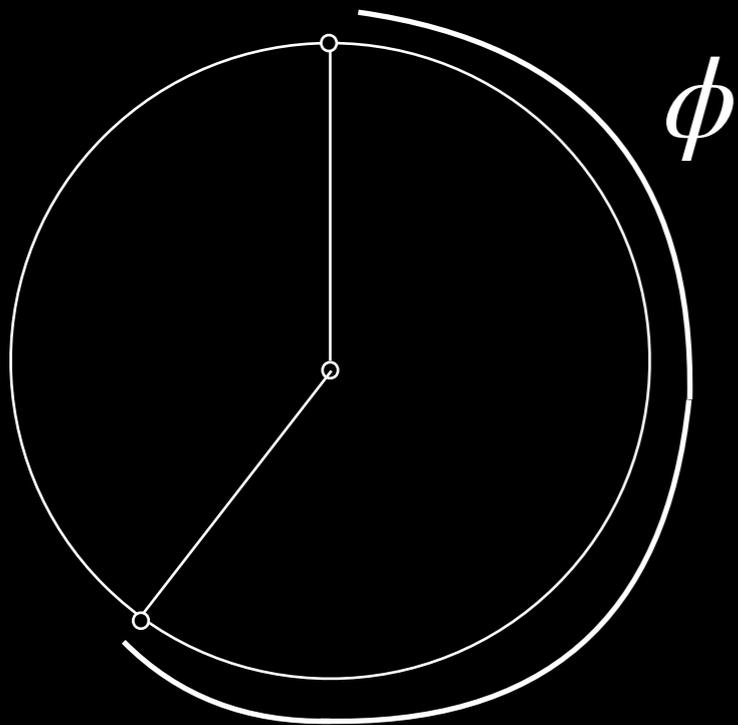
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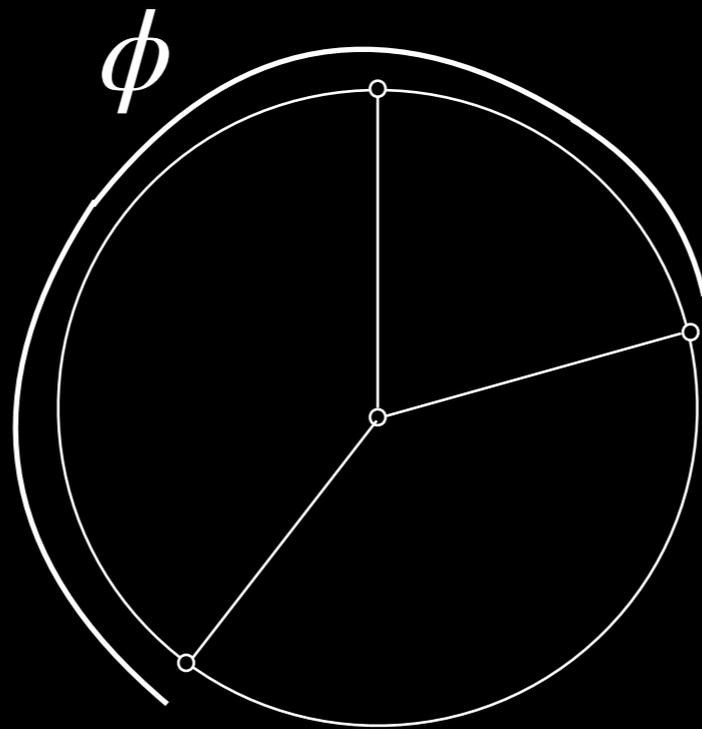
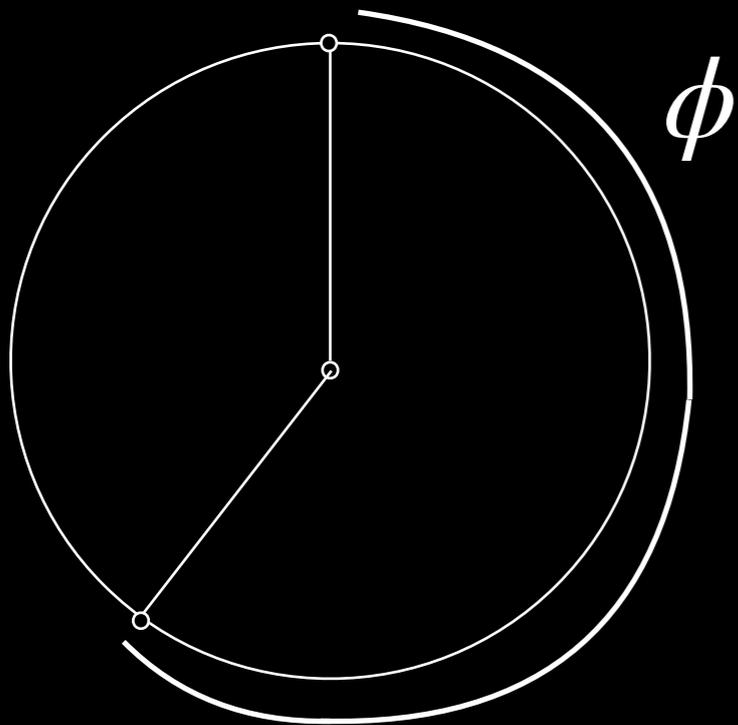
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How to get “evenly” spaced spokes,  
when don’t know  $W$  in advance?

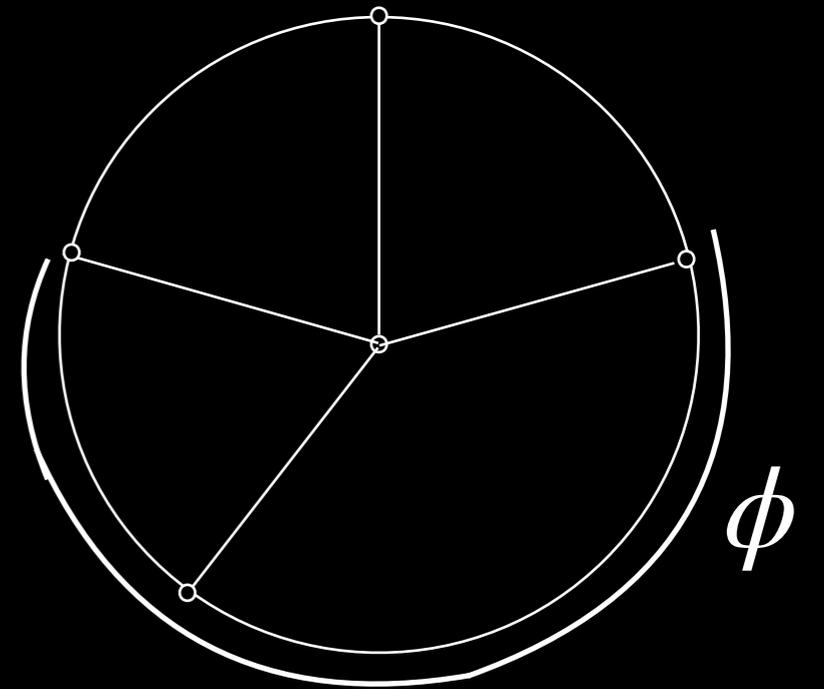
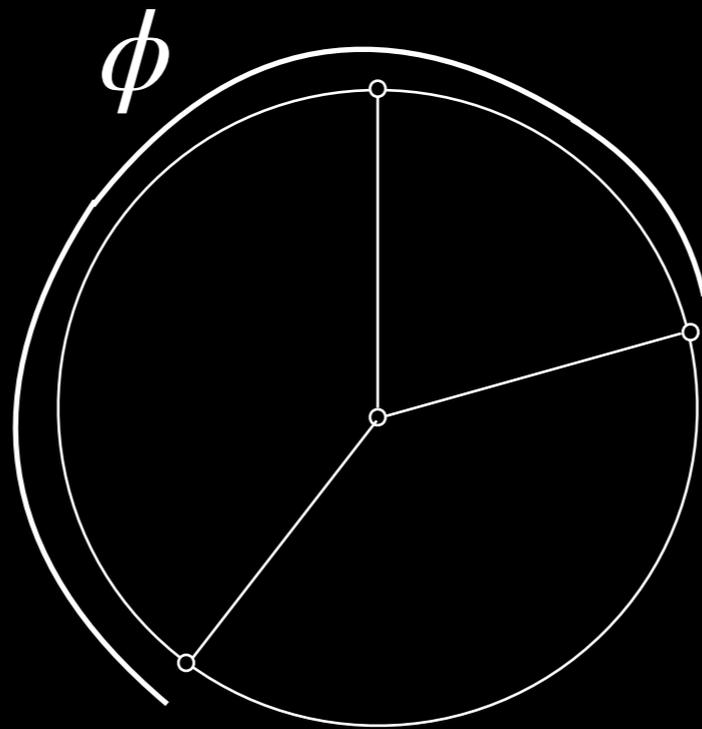
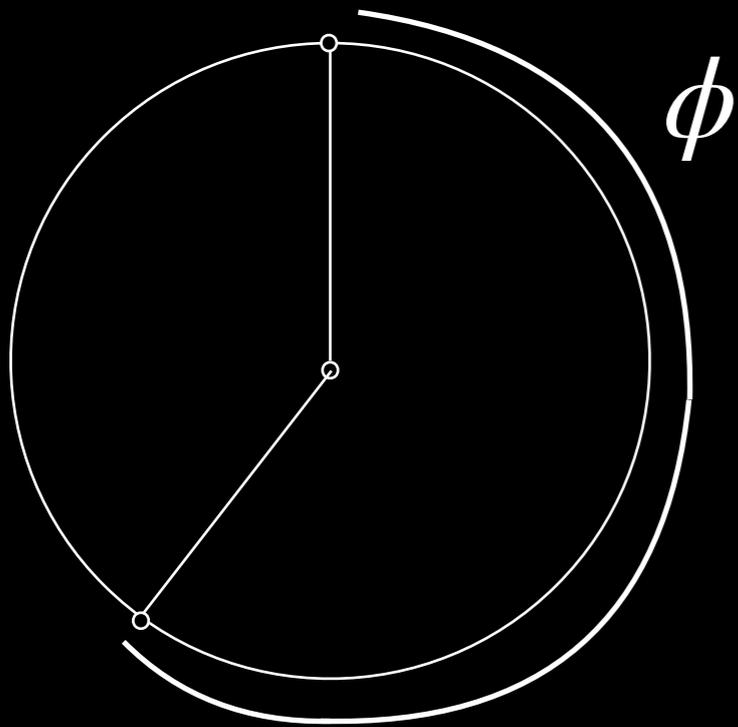
Idea: Use  $\phi$



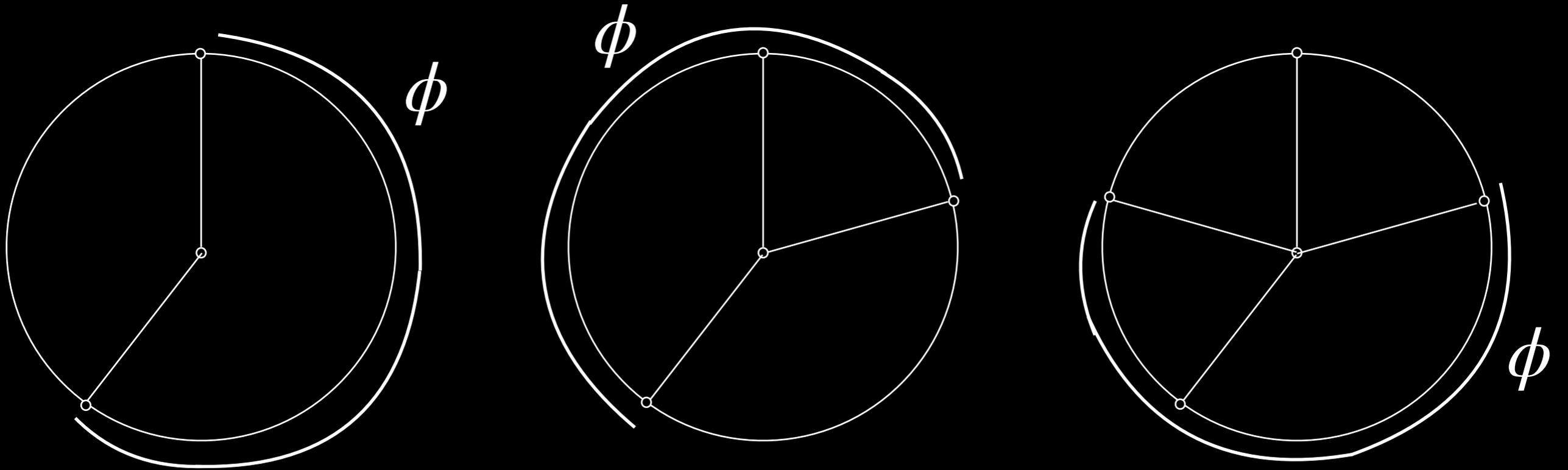
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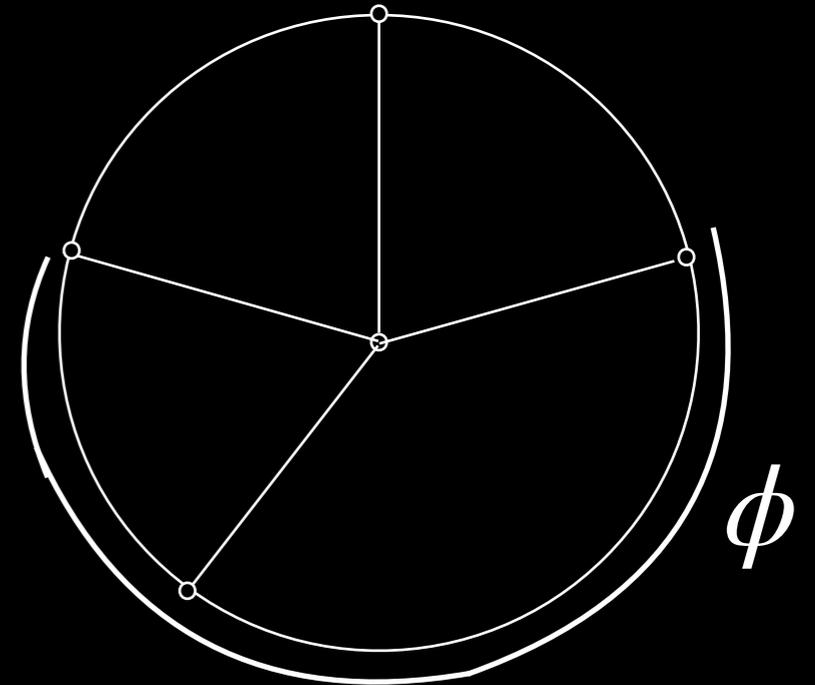
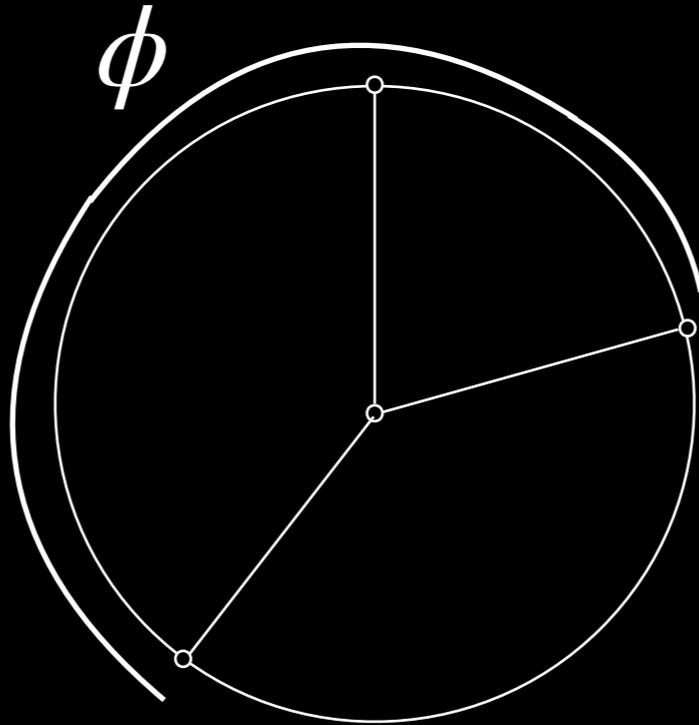
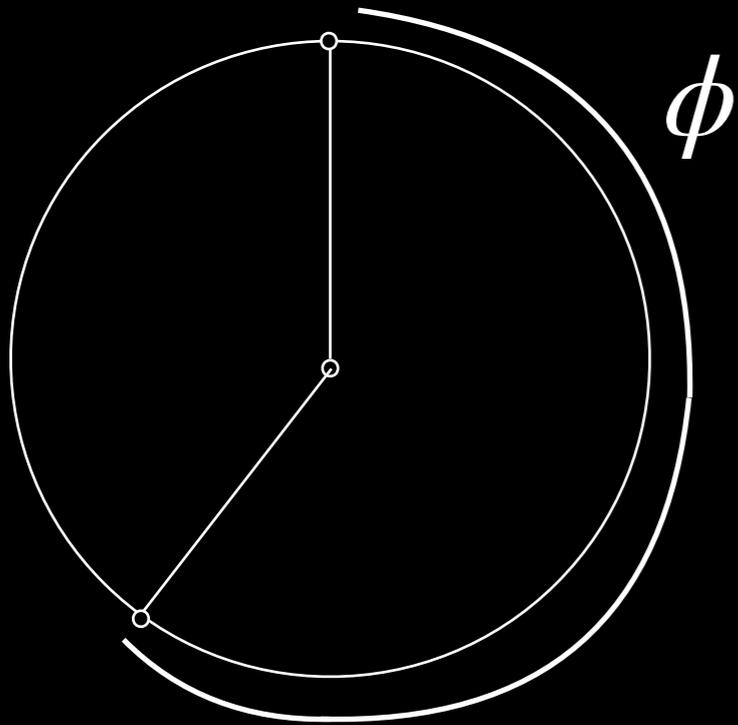
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[Swierczkowski, '58]  $M$  points placed at arc distance  $\phi \rightarrow$  arc length between any neighboring points is  $O(1/M)$

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arc lengths between neighboring spokes are  $\approx 1/4$

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“Hardest to approximate” number  $\rightarrow$  all  $x_i = 1$

To get this, set  $y = 1 + \frac{1}{y}$ . Solving yields:  $y = \phi$

# Why does $\phi \rightarrow$ well-spread?

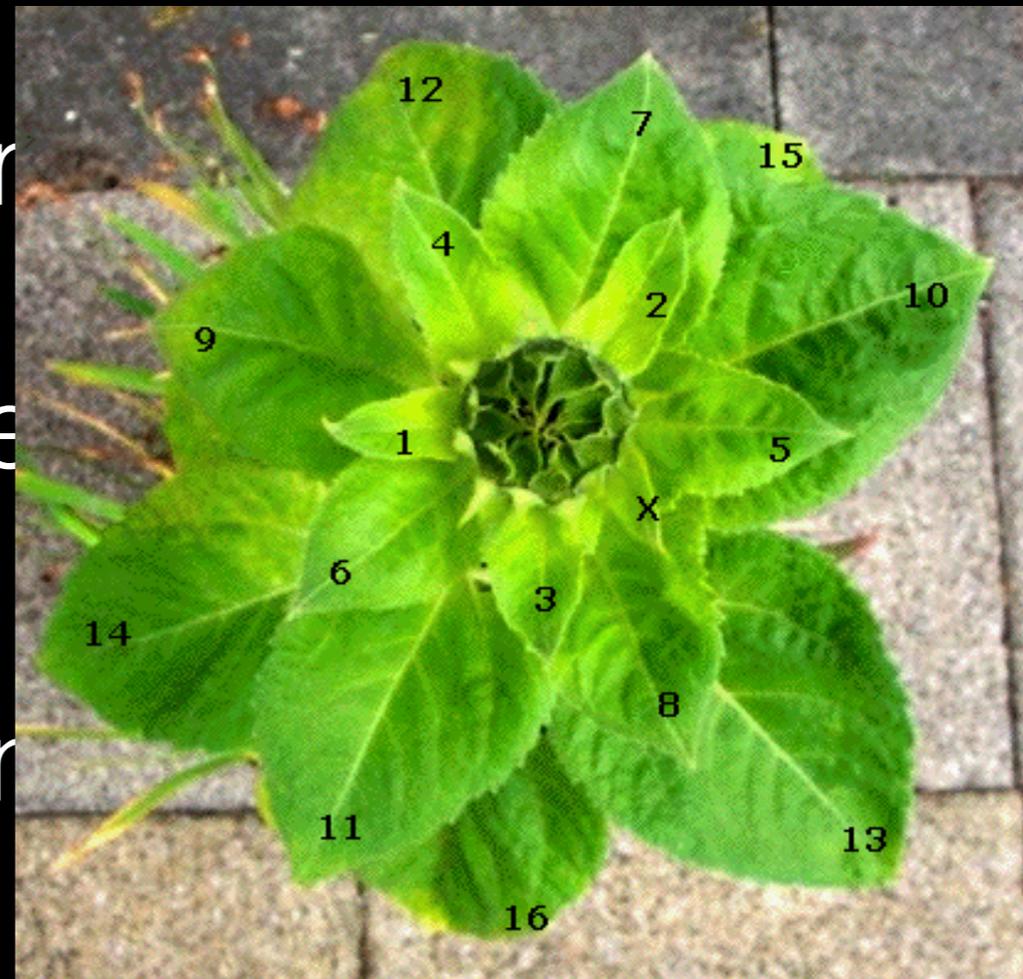
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where  $x_i$  are integers. “very irrational”  $\rightarrow$  well-spread

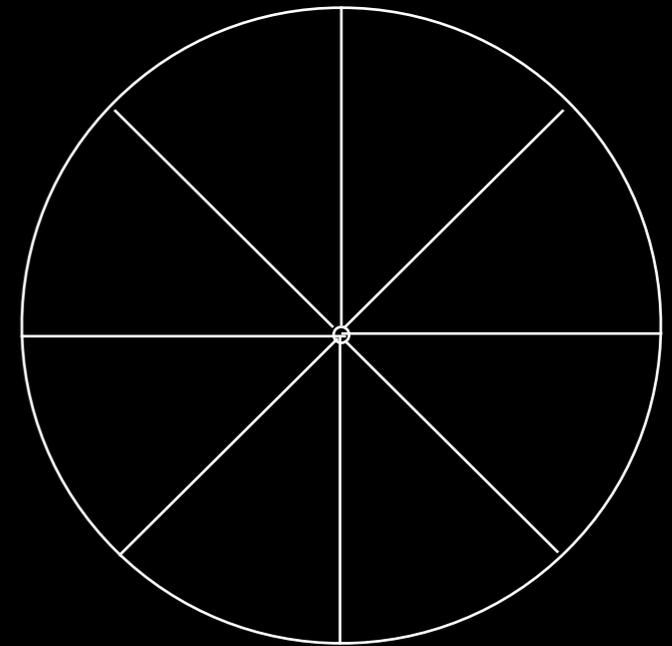
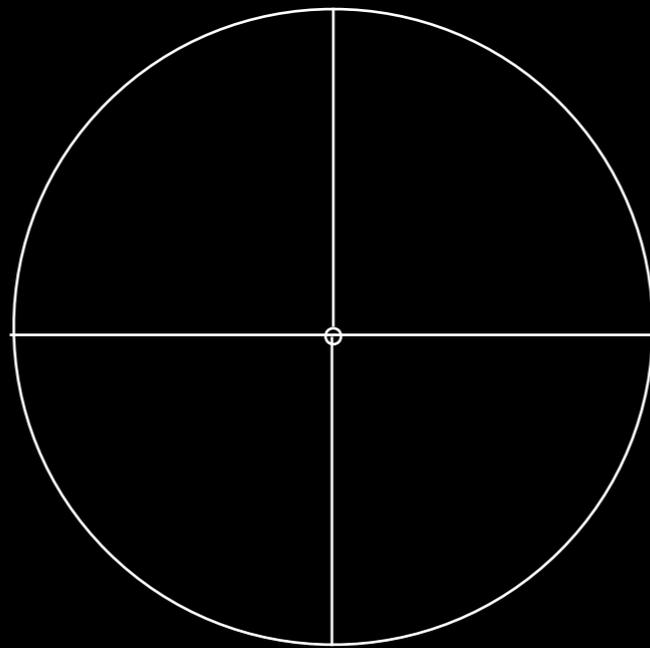
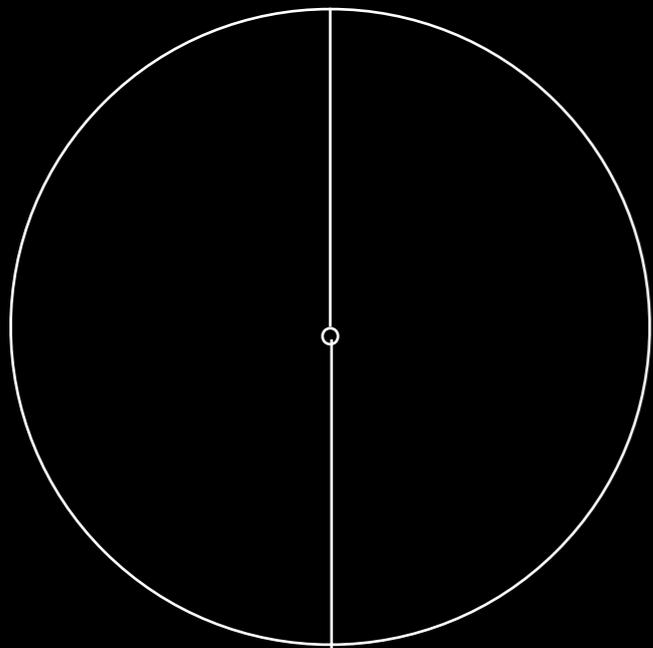
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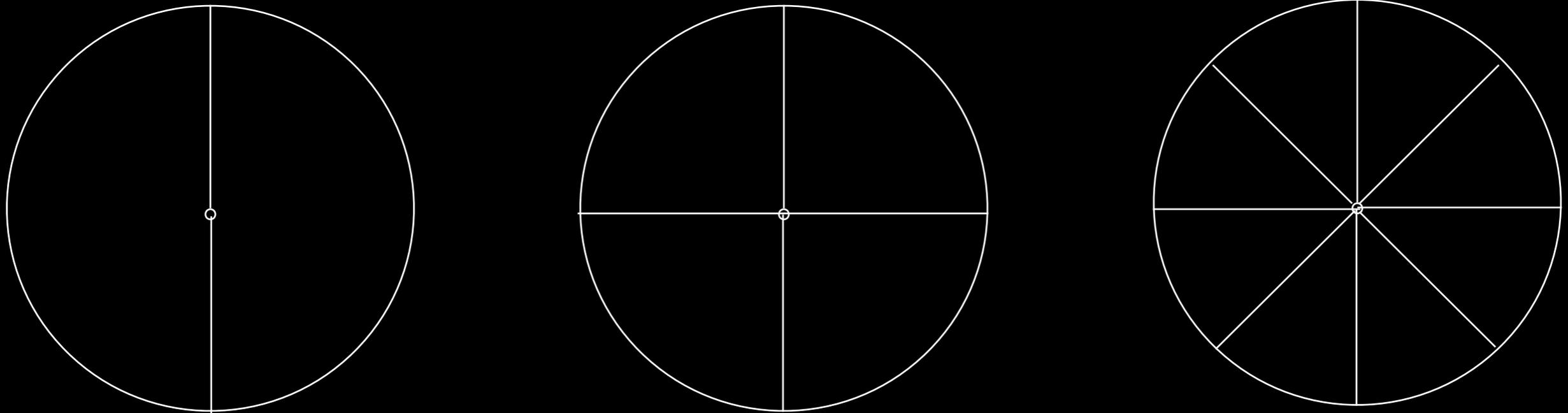


# Why not powers of 2?



Q: Why not have  $2^i$  evenly spaced spokes in iteration  $i$ ?

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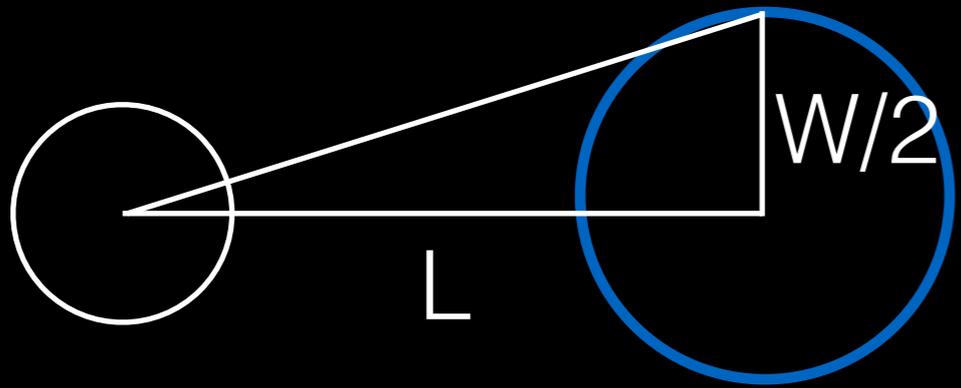


Q: Why not have  $2^i$  evenly spaced spokes in iteration  $i$ ?

A1: Off from optimal number of spokes by  $\leq$  factor of 2

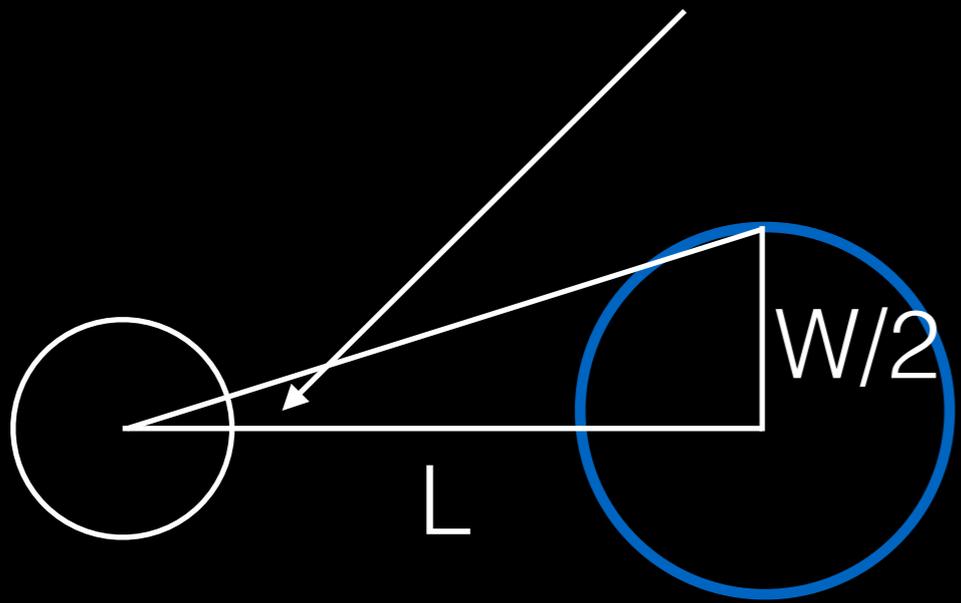
A2: Requires memory for the counter, and also adds algorithmic complexity.

# How many spokes?



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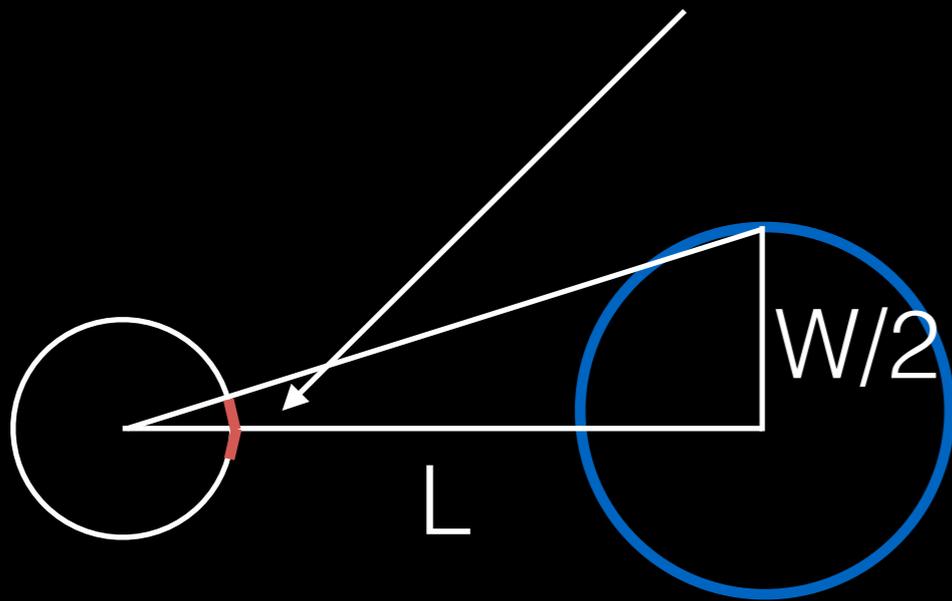
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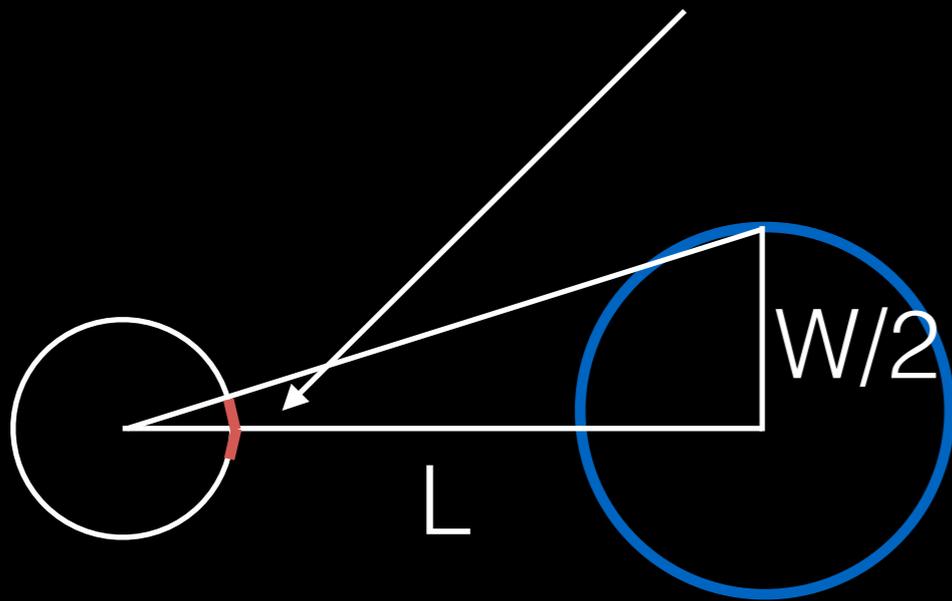
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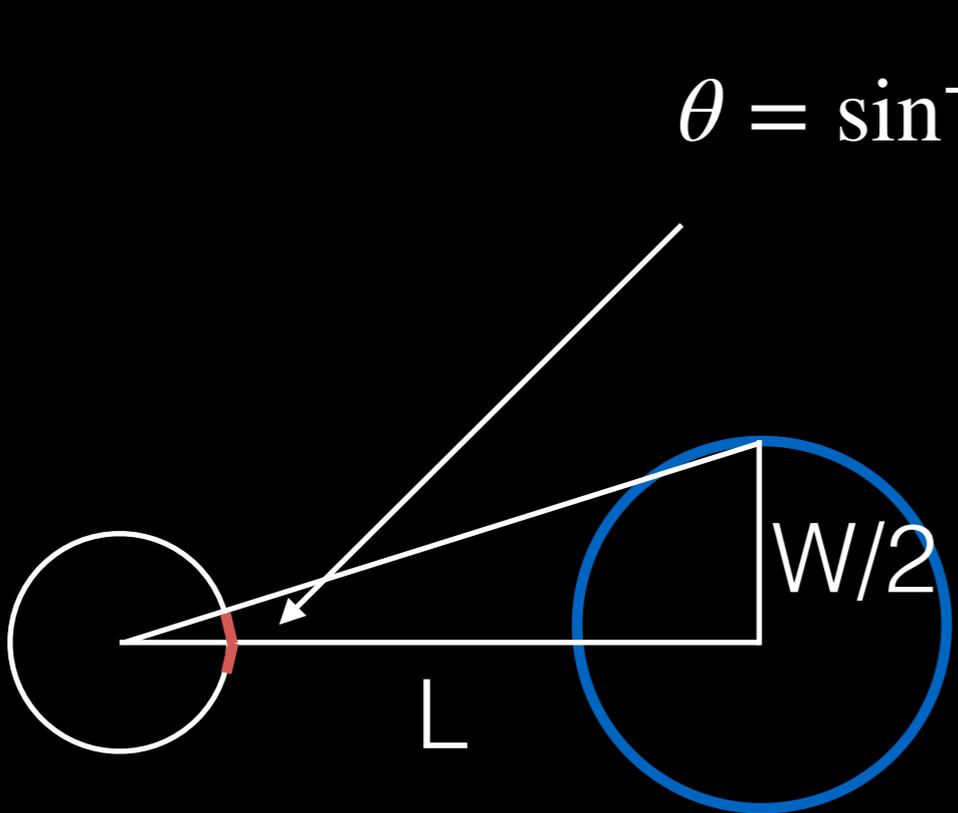


Let  $\alpha$  be arc length  
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$$\alpha = \frac{1}{\pi} \sin^{-1} \frac{W}{2L}$$

Power Series:  $\sin^{-1} x \geq x$ , for  
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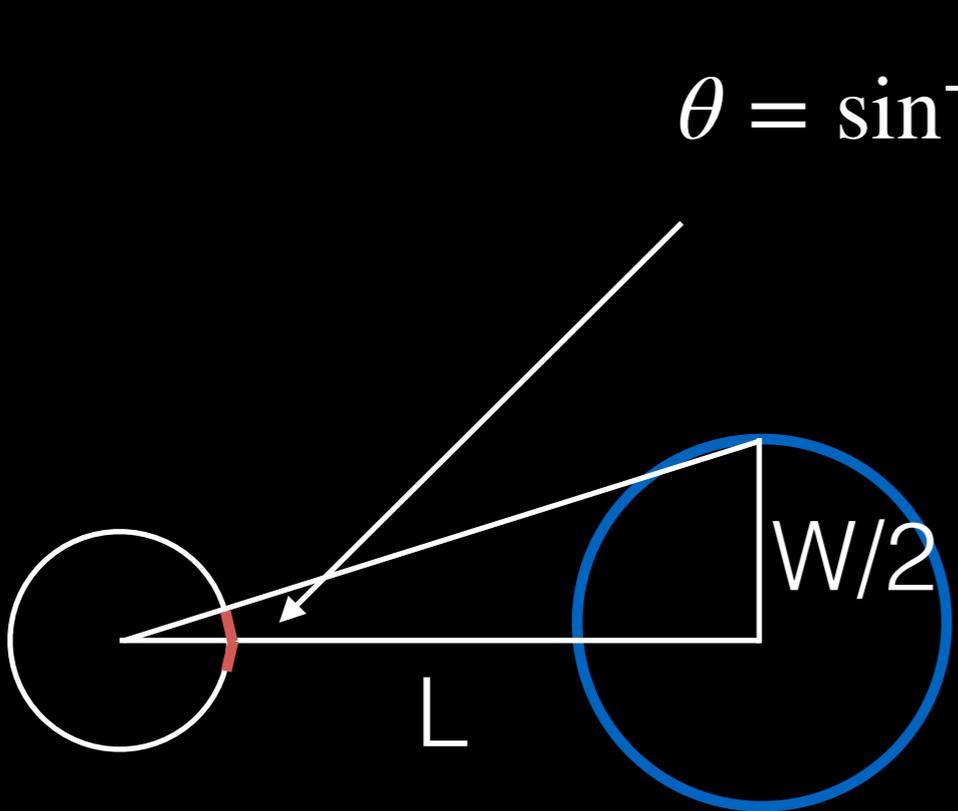
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So by [Swierczkowski, '58], need  $O(L/W)$  spokes

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$O(L^2/W)$  search time!  
If know  $L$  in advance

$$\text{Thus, } \alpha \geq \frac{W}{2\pi L}$$

So by [Swierczkowski, '58], need  $O(L/W)$  spokes

# How to handle unknown L?

Spoke Length

# spokes

	1	2	4	8	16
1					
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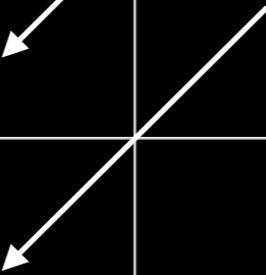
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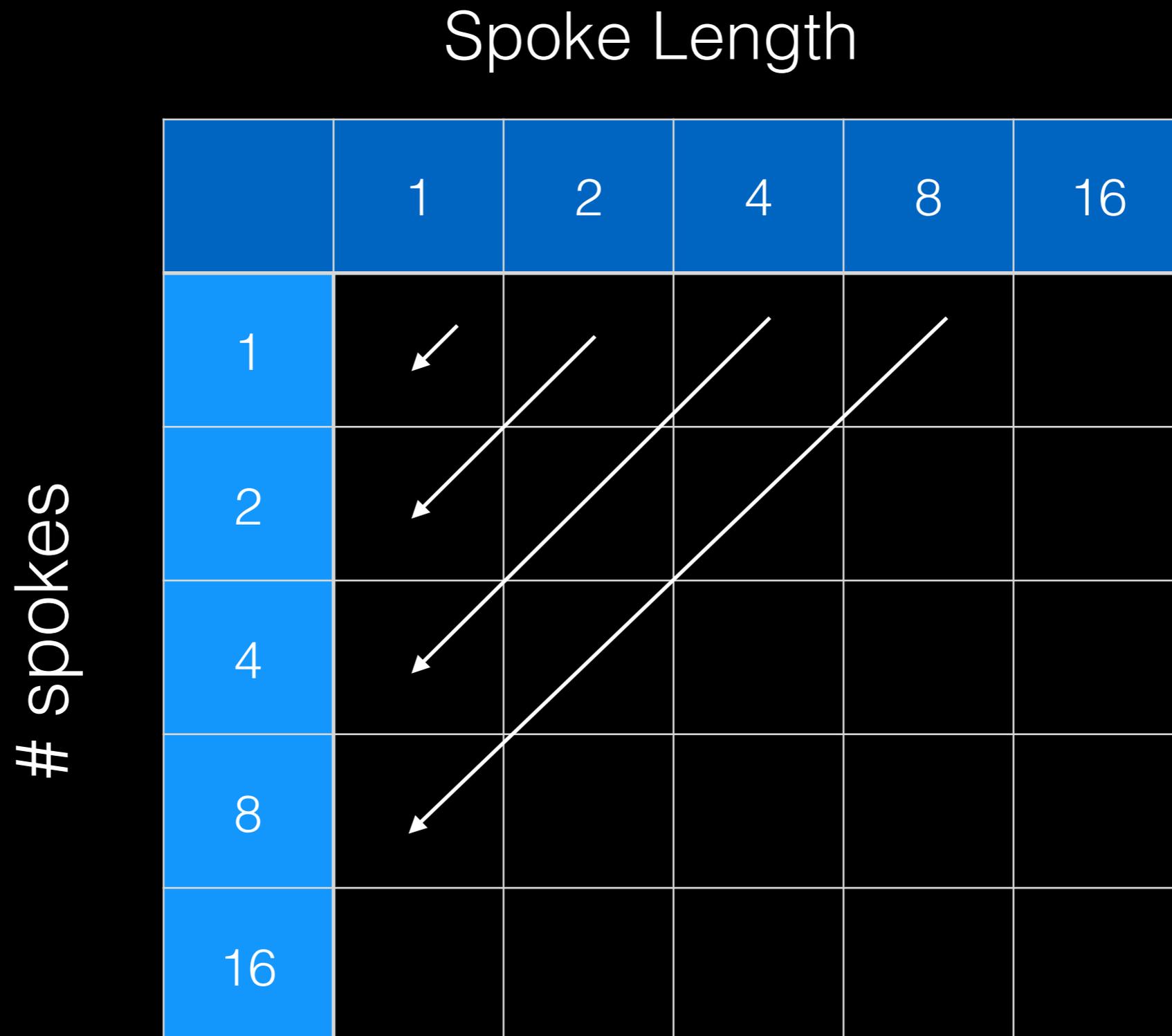
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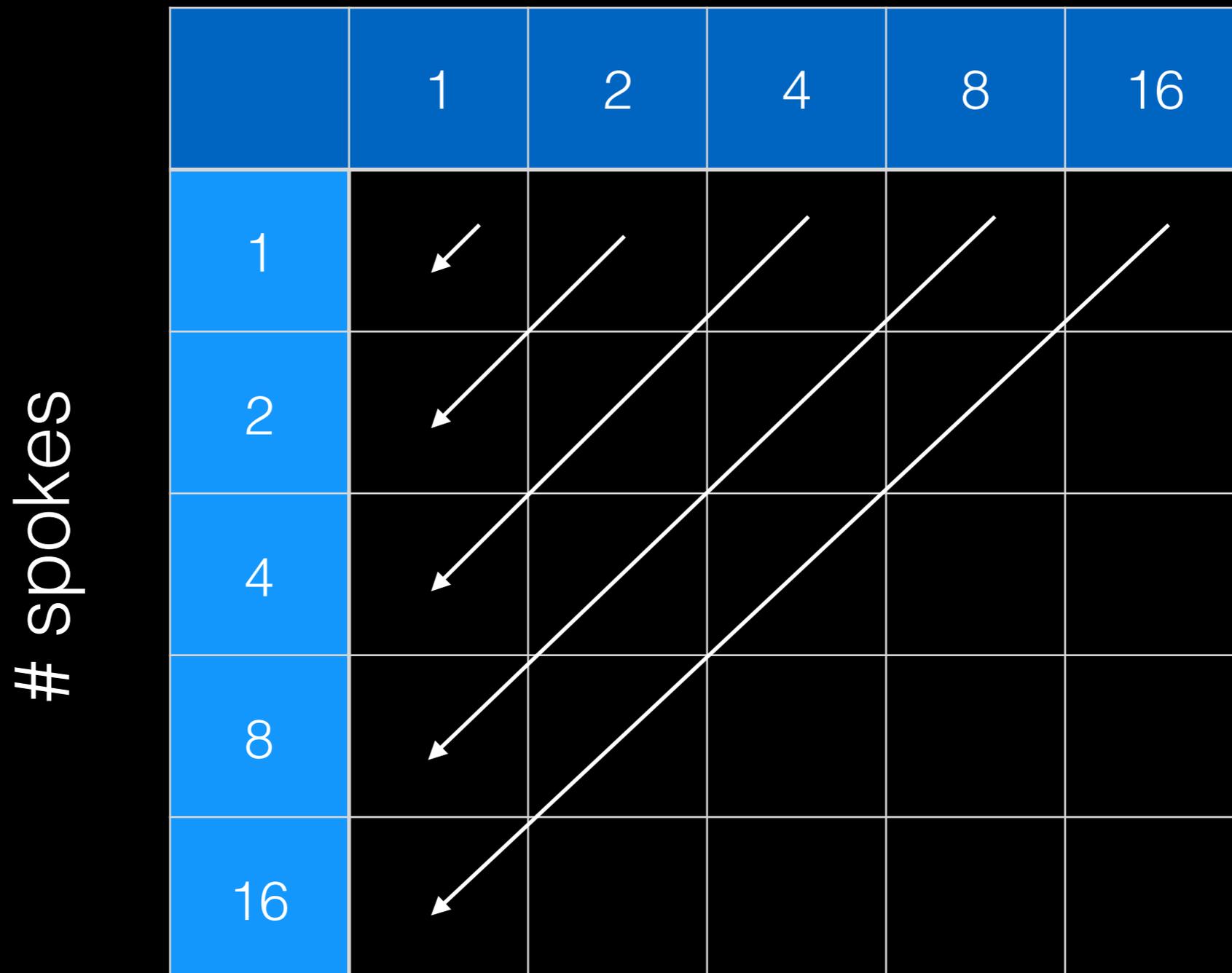
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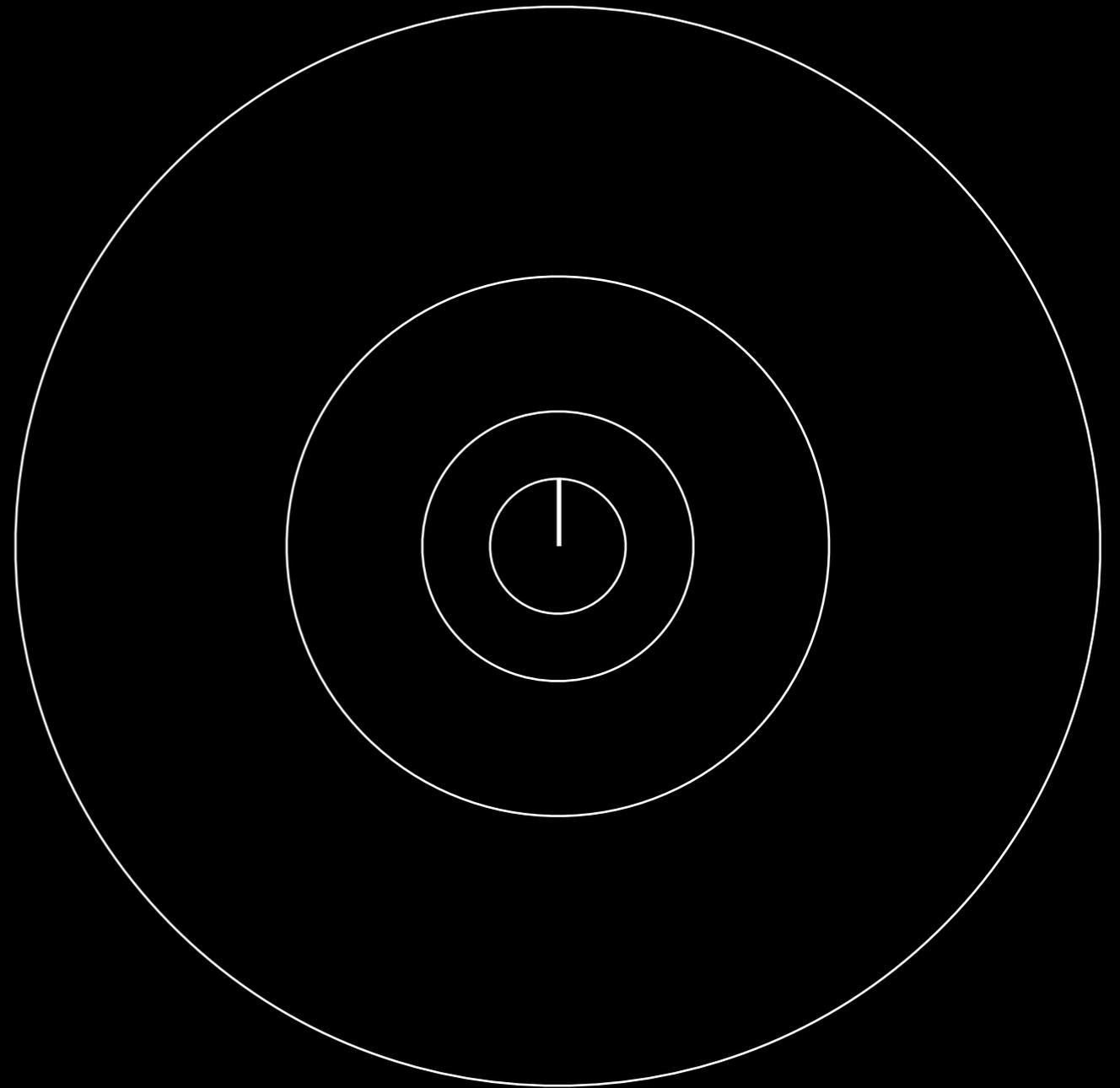
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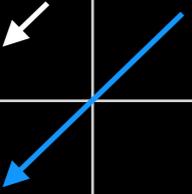
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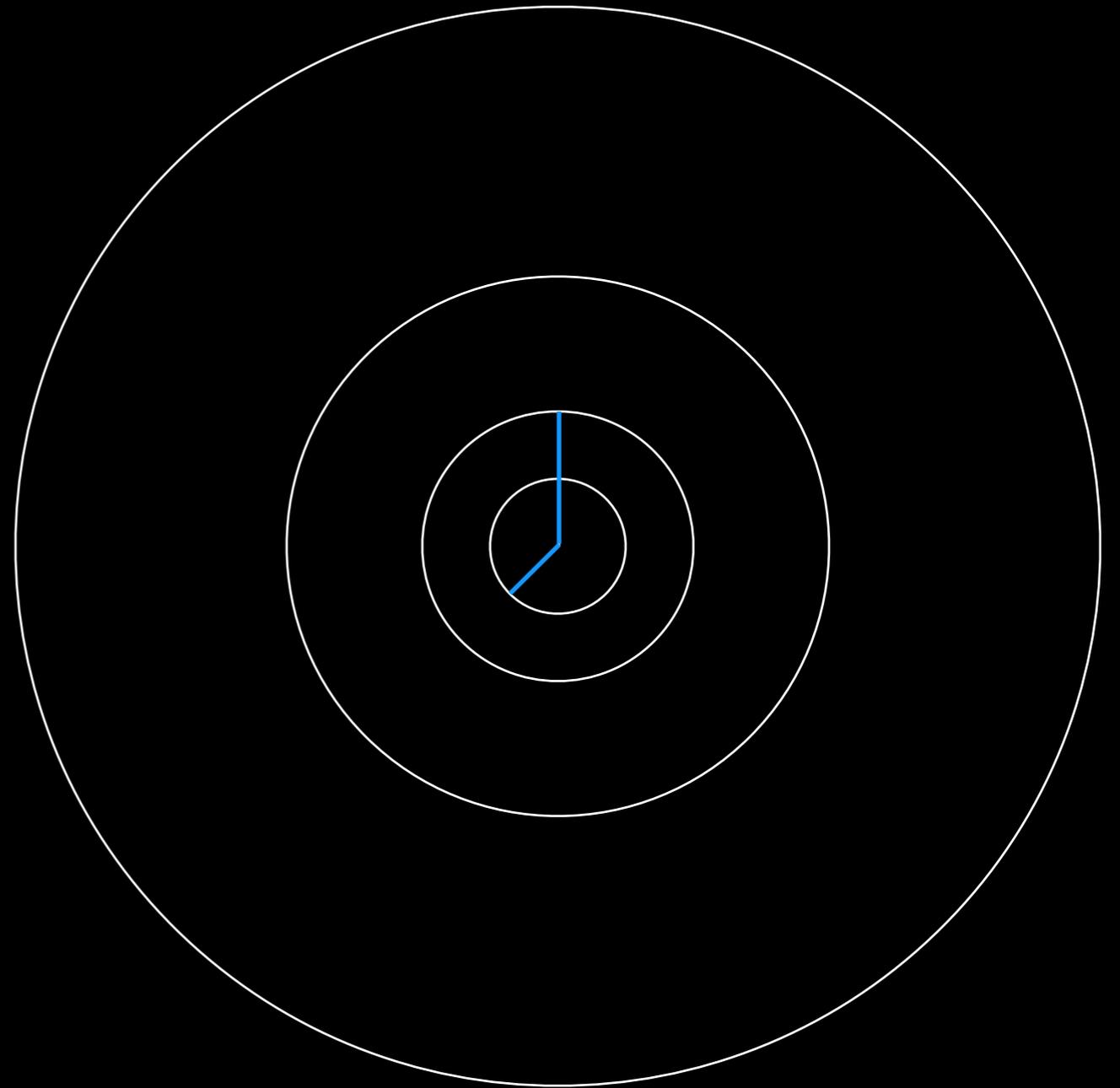
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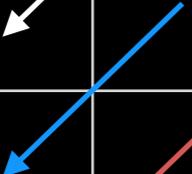
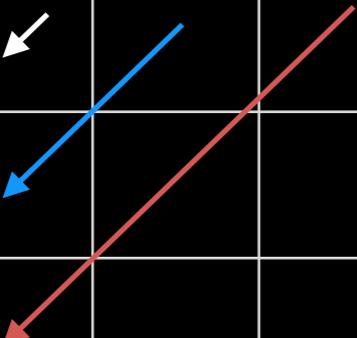
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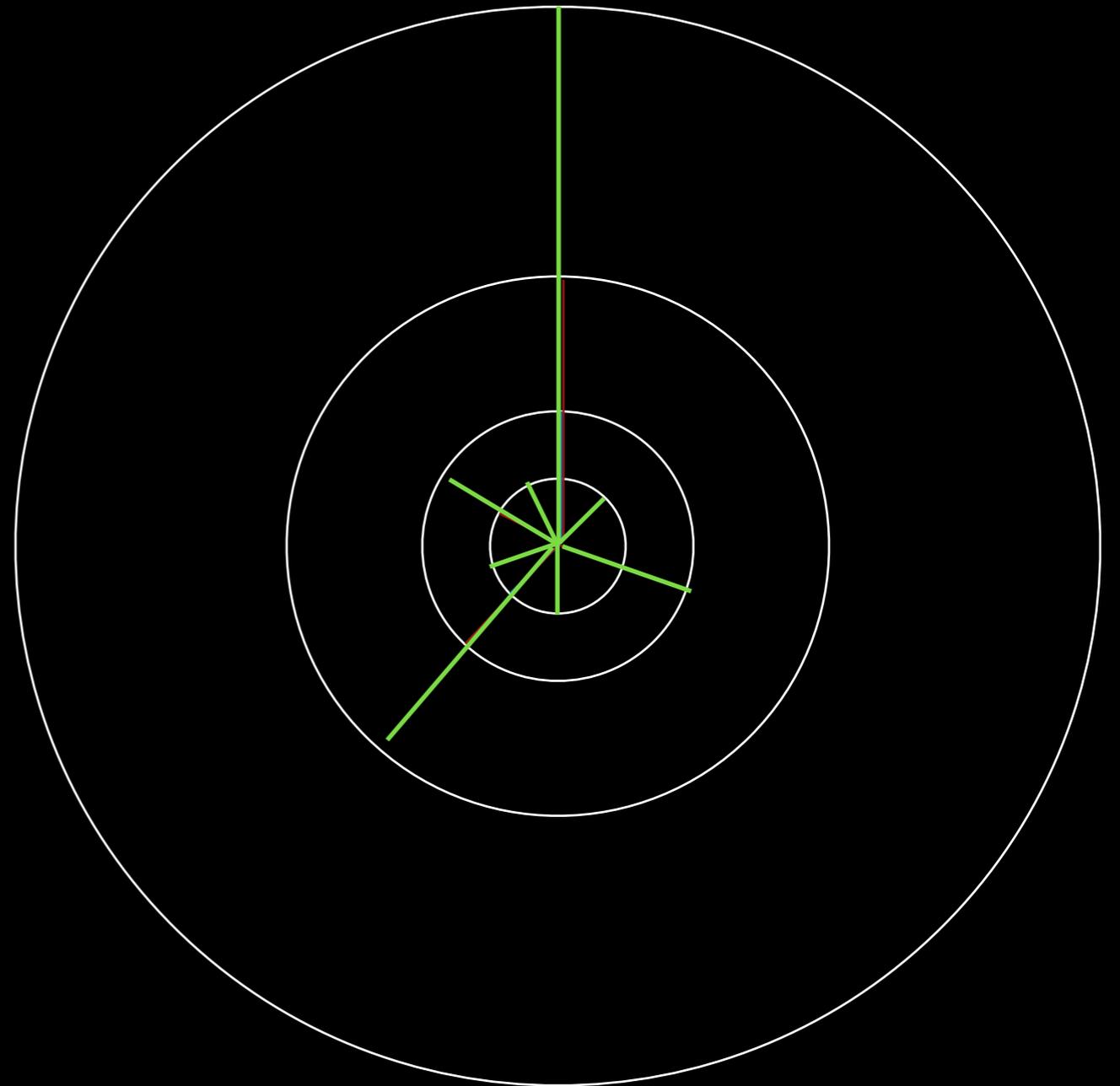
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# Stream Problem

	1	2	4	8	16
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1) Target hidden in a cell

2) Algorithm chooses a stream of cells

3) Game ends when algorithm finds target

Total cost is sum of costs of cells searched

Cell  $(x,y)$  costs  $x \cdot y$

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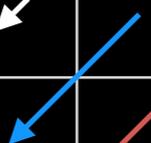
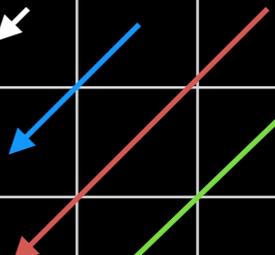
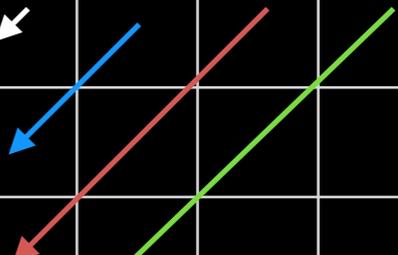
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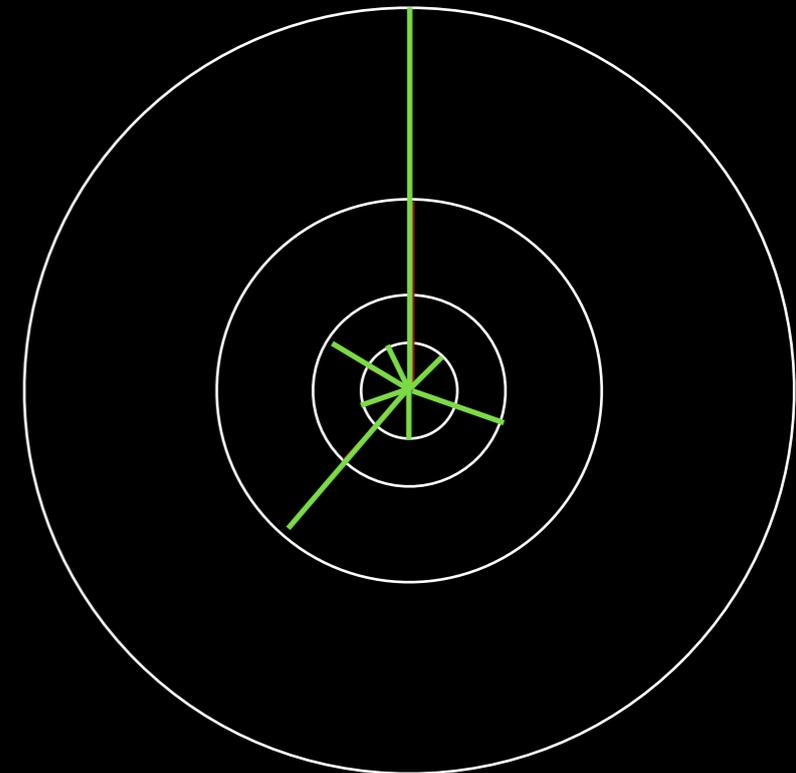
# GoldenFA

For epoch  $i = 1$  to  $\infty$ ,

For each  $1 \leq x \leq i$ ,

Make  $2^{i-x}$  spokes of length  $2^x$ ,  
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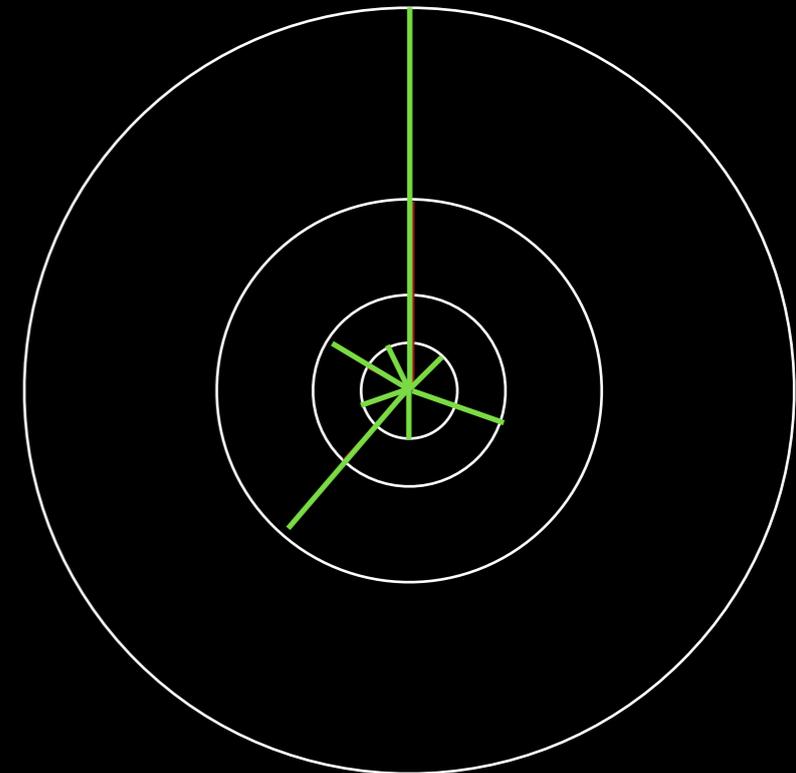
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Number of epochs before reaching distance  $L$ :

$O(\log L)$

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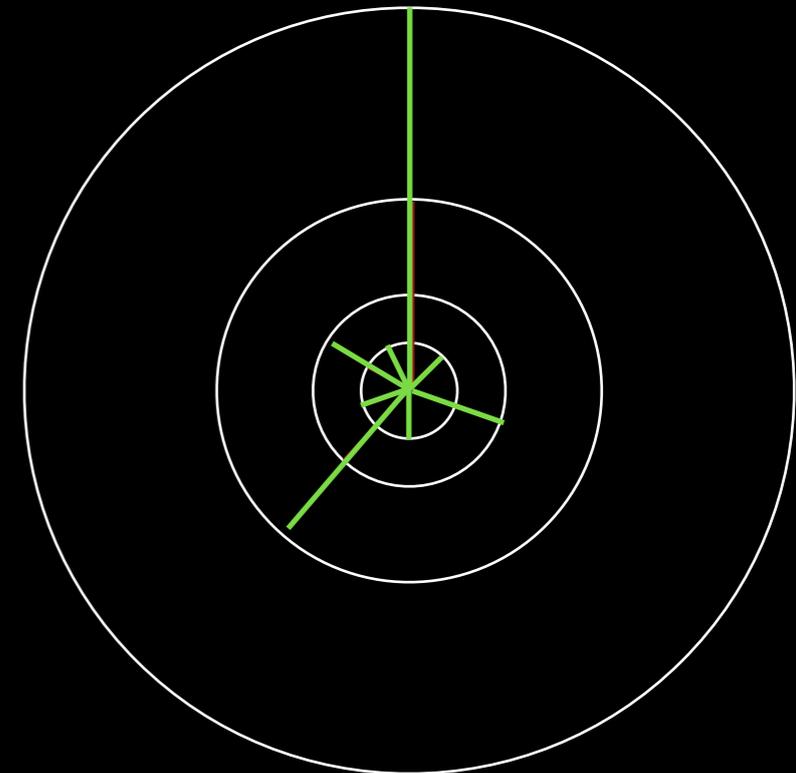
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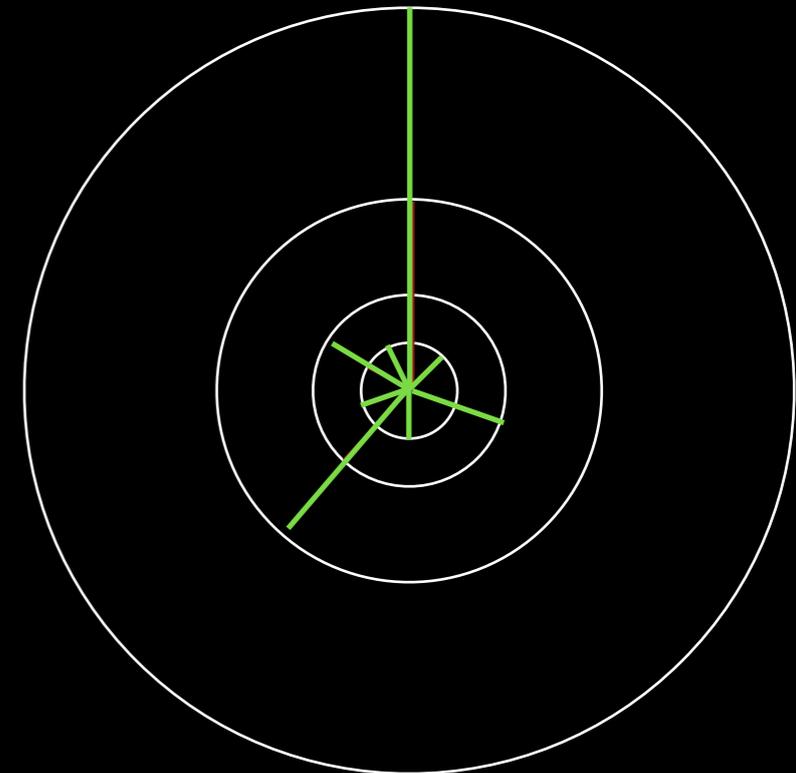
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Number of epochs before the spokes are  
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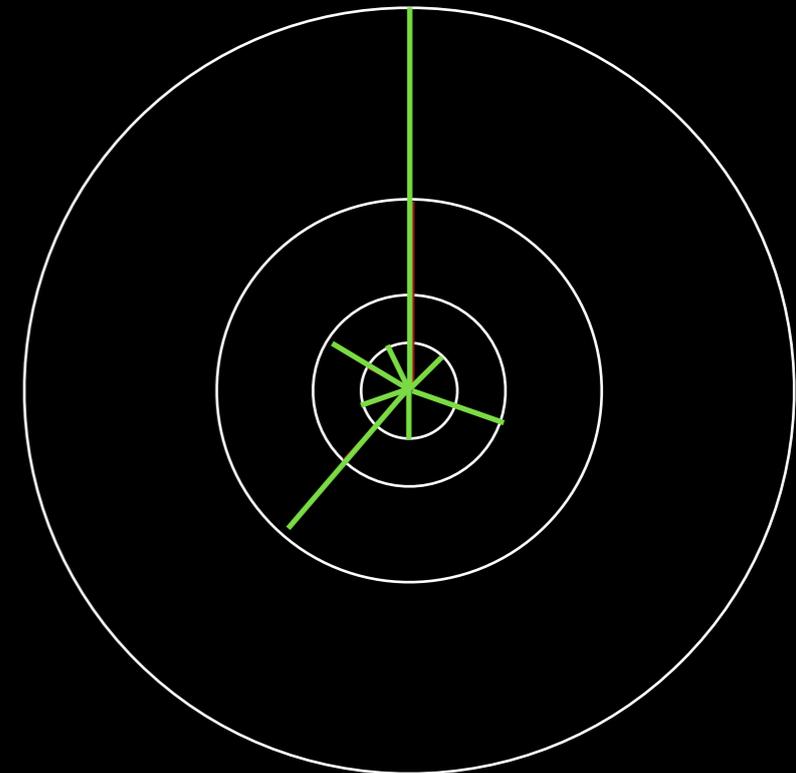
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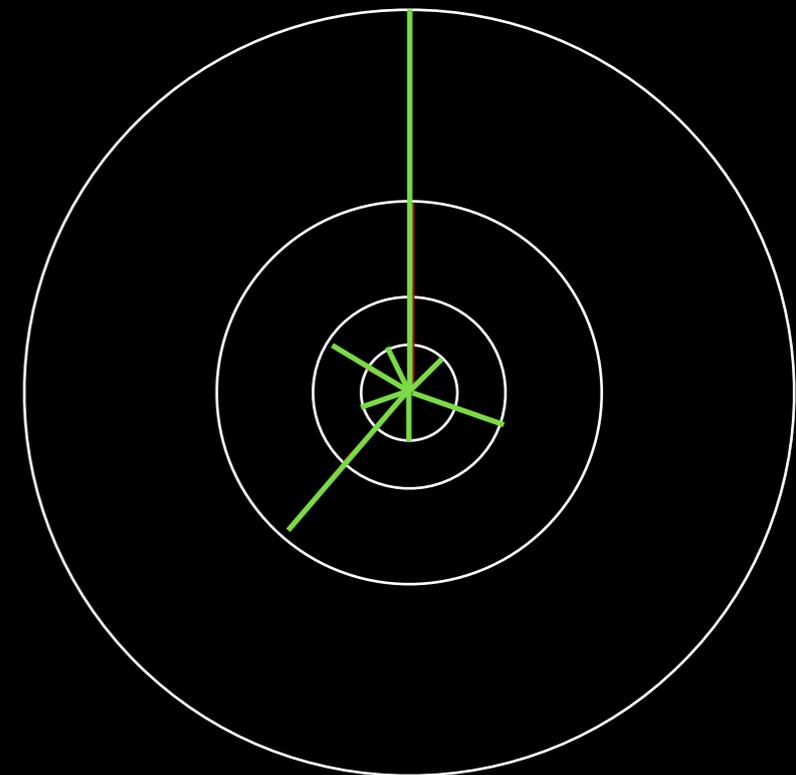
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Number of epochs before the spokes are  
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Cost for epoch  $i$ :  $2^i \cdot i$

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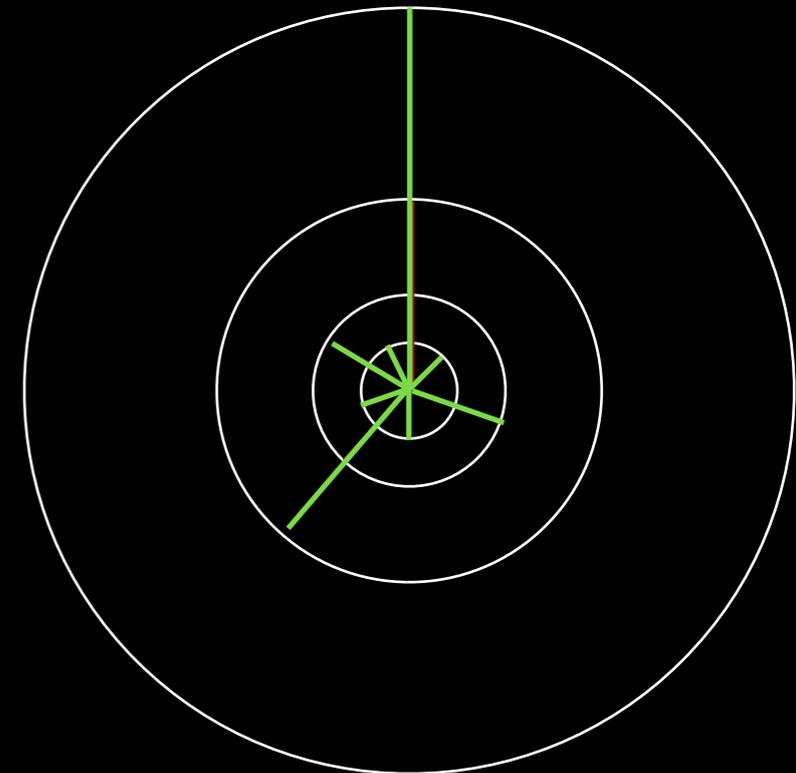
Make  $2^{i-x}$  spokes of length  $2^x$ ,  
rotated by  $\phi$

Number of epochs before reaching distance  $L$ :  
 $O(\log L)$

Number of epochs before the spokes are  
sufficiently close:  $O(\log(L/W))$

Cost for epoch  $i$ :  $2^i \cdot i$

	1	2	4	8	16
1	↖	↙	↘	↗	
2		↙	↘	↗	
4			↘	↗	
8				↗	
16					



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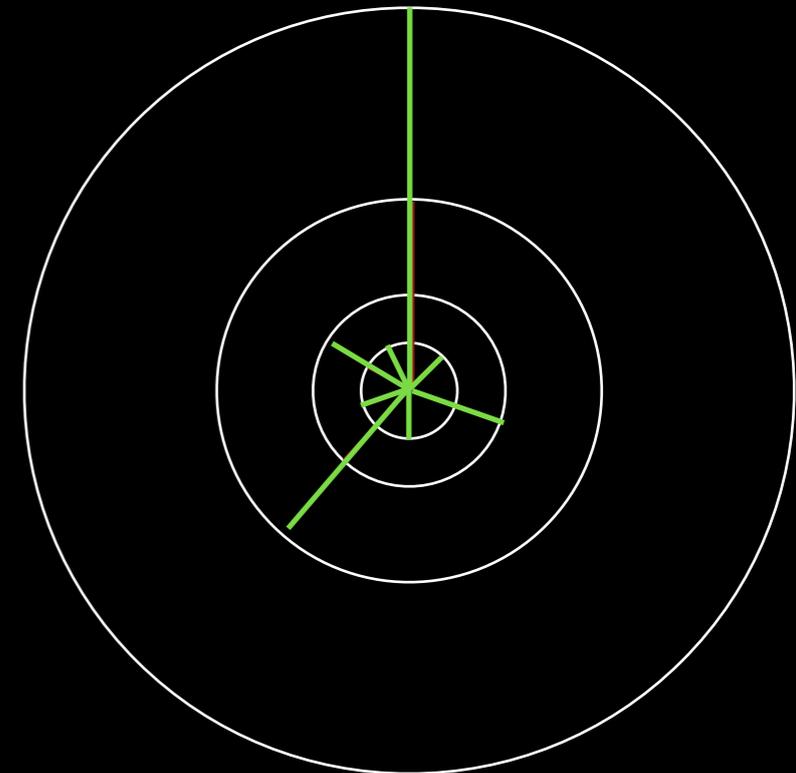
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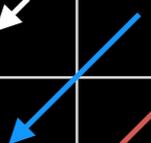
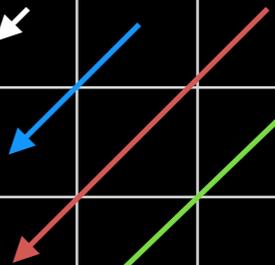
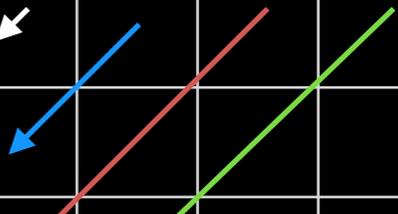
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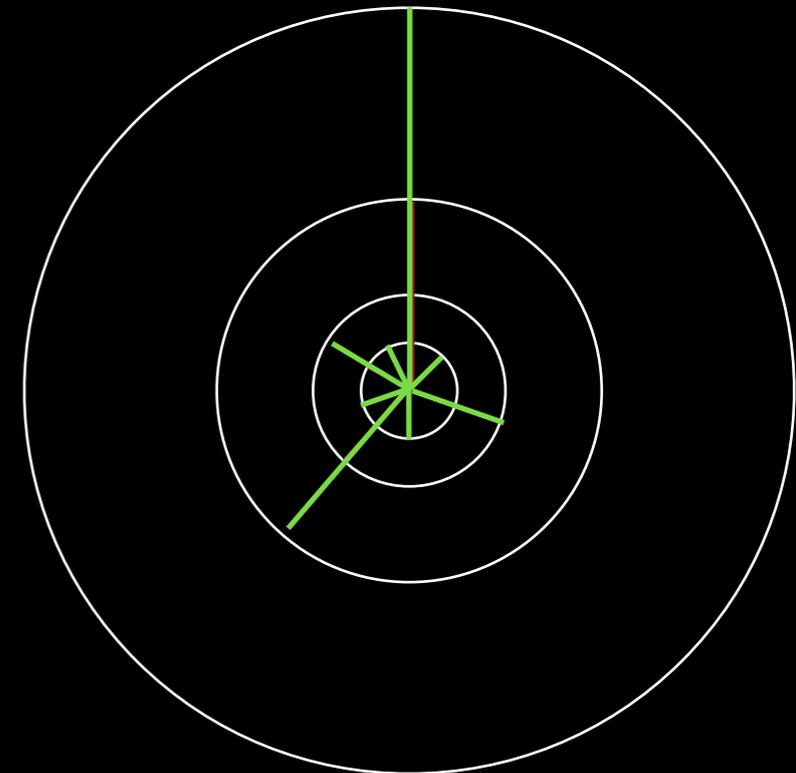
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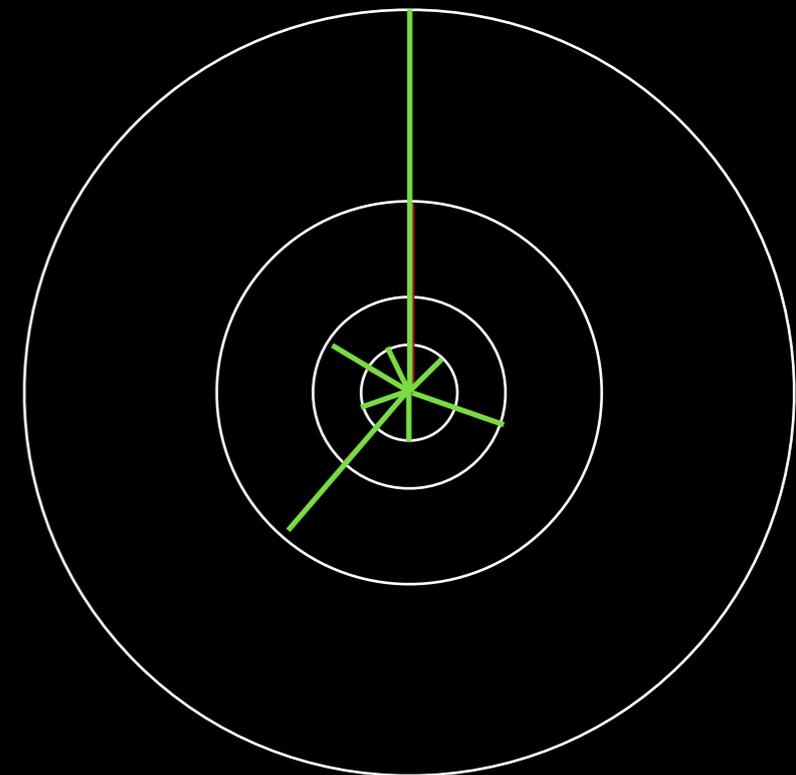
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Multiple Searchers?

Multiple Searchers?

Random Initial Orientation!

# $N$ Agents

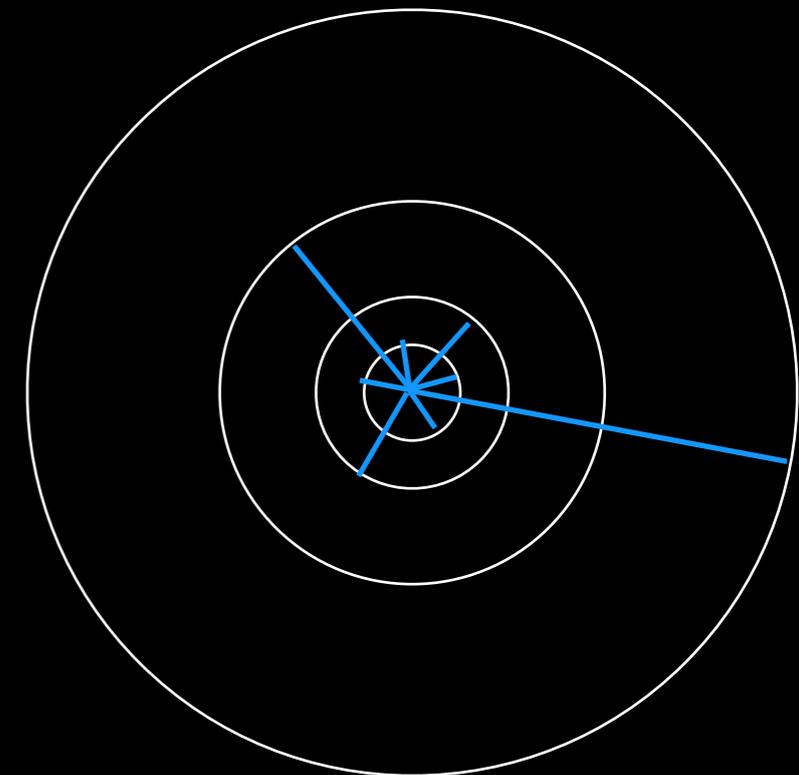
Each agent chooses a random initial heading

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$N = 3$



# $N$ Agents

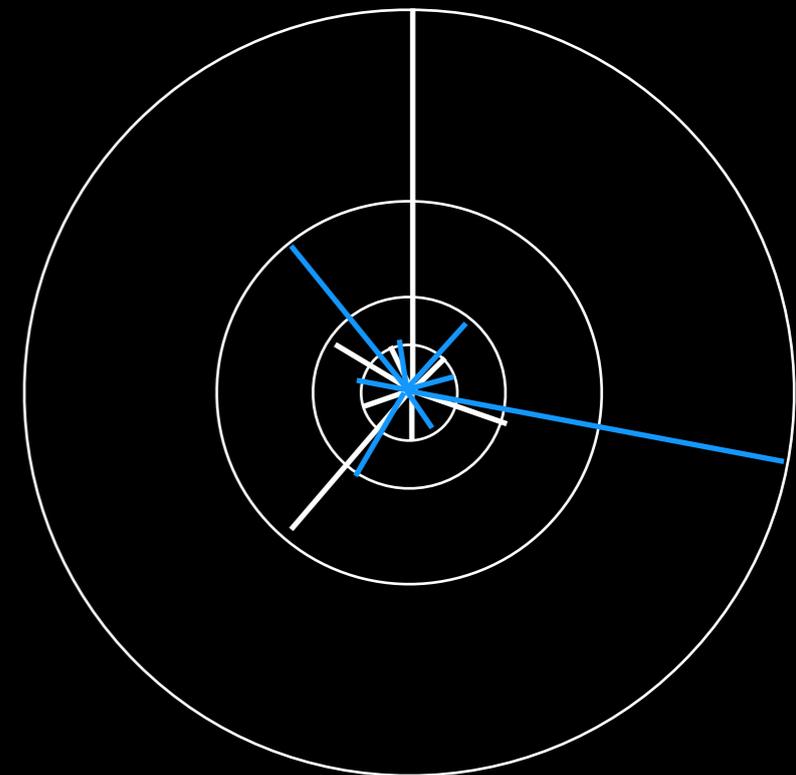
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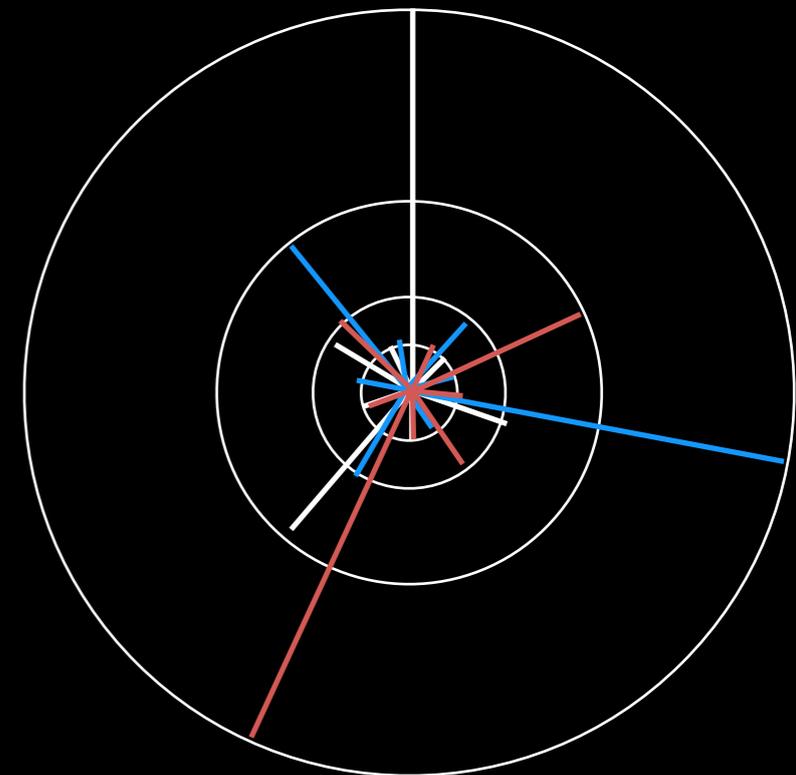
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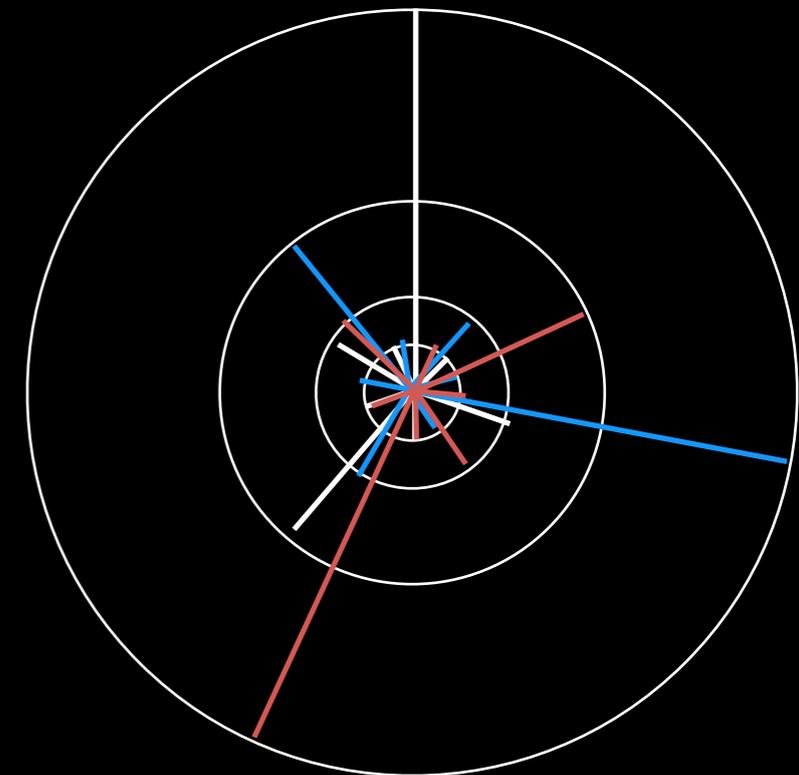
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$t < N$  faults

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$$O \left( \left( L + \frac{L^2(t+1)}{NW} \right) \log L \right)$$



$N$  Agents;  $t < N$  faults

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“Spoke-based”: All search via line segments from nest

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Compute expected # agents finding target in each epoch

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Yao’s Lemma  
on Stream Problem

“Spoke-based”: All search via line segments from nest

# Experiments

# F&K Advice

Each agent does the following:

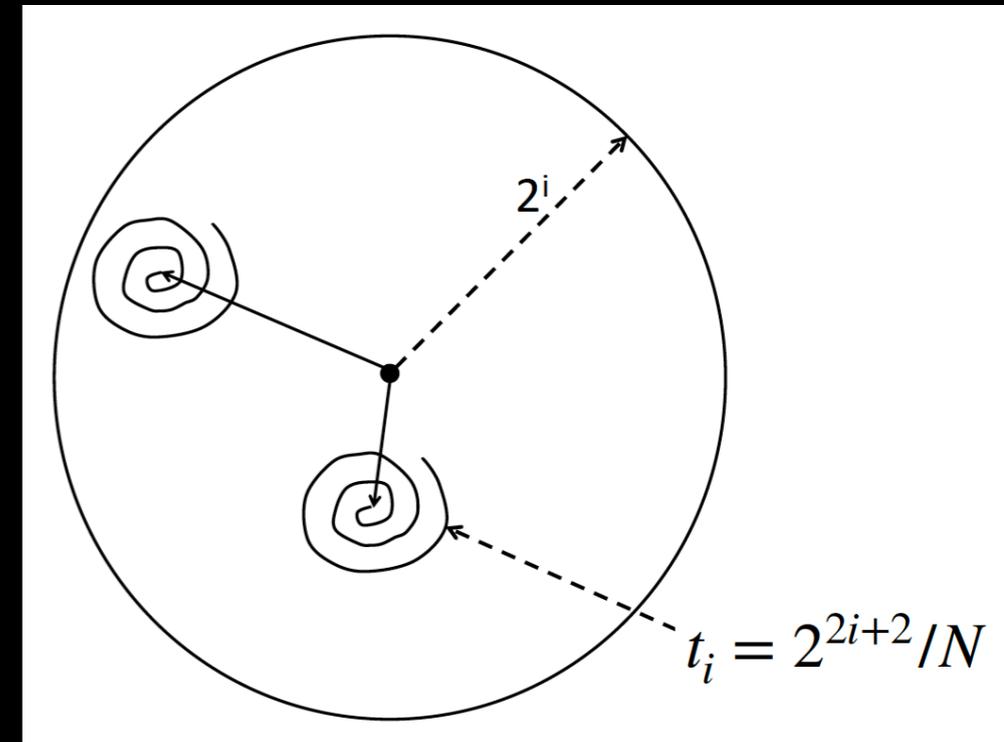
For stage  $j = 1$  to  $\infty$

For phase  $i = 1$  to  $j$

Go to a random point at distance  $\leq 2^i$

Spiral search for time  $2^{2i+2}/N$

Return to nest



# F&K Advice

Each agent does the following:

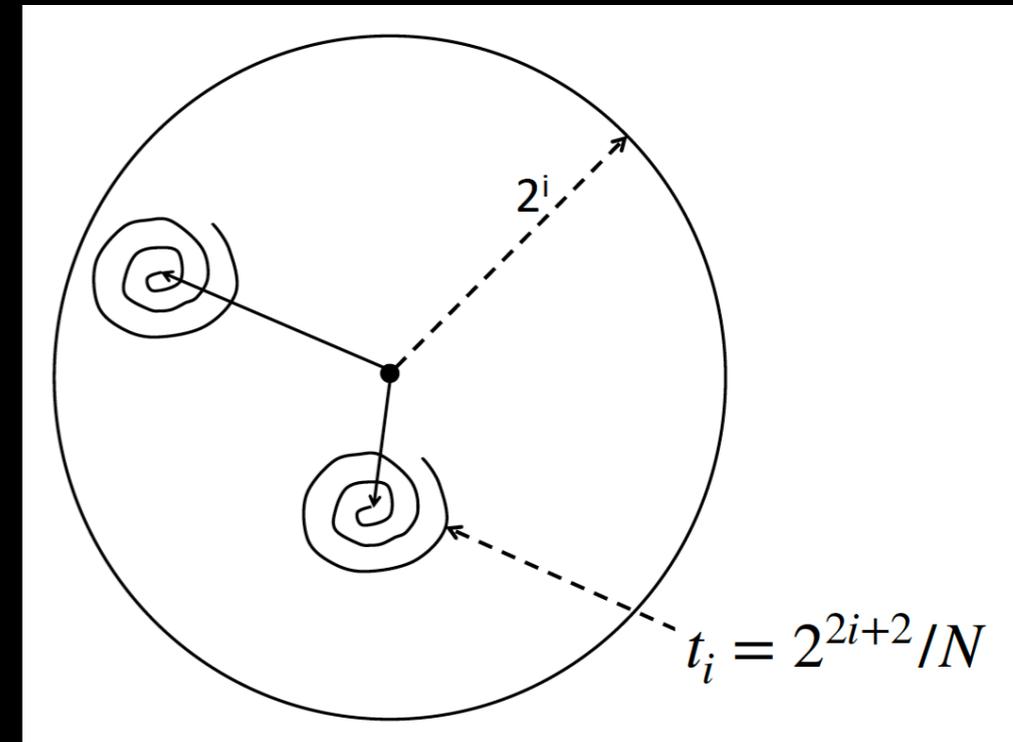
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For phase  $i = 1$  to  $j$

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Return to nest



$\log N$  bits of advice to know  $N$

$\log \log N$  bits of advice to know 2-approximation to  $N$

# F&K NoAdvice (fix $\epsilon > 0$ )

Each agent does the following

For epoch  $\ell = 0$  to  $\infty$

For stage  $i = 0$  to  $\ell$

For phase  $j = 0$  to  $i$

Go to a random point at distance  $\leq \sqrt{\frac{2^{i+j}}{\lceil \log^{1+\epsilon} 2^j \rceil}}$

Spiral search for time  $\frac{2^{2i+2}}{\lceil \log^{1+\epsilon} 2^j \rceil}$

Return to nest

# Algorithms Tested

Algorithm	Advice (bits)	Robustness	Runtime
F&K (advice)	$O(\log \log N)$	Not Robust	$O\left(L + \frac{L^2}{N}\right)$ for $W = \Theta(1)$
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## GoldenFA-Heuristic:

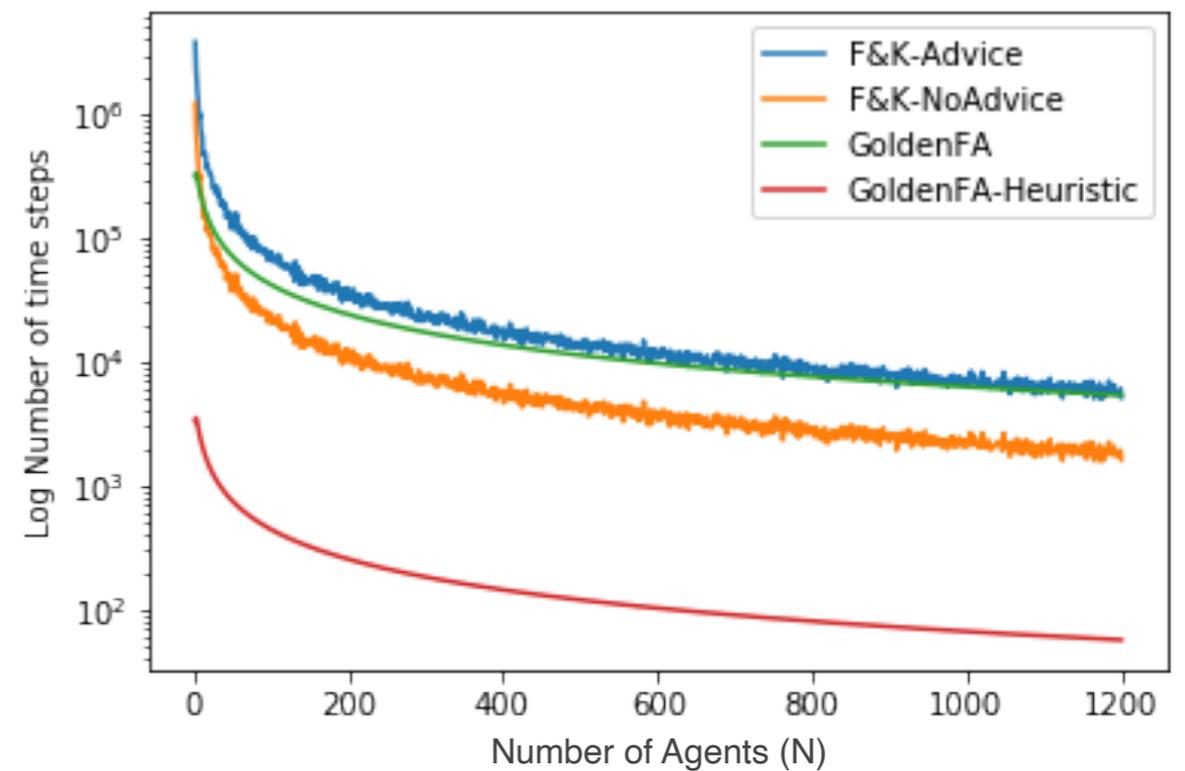
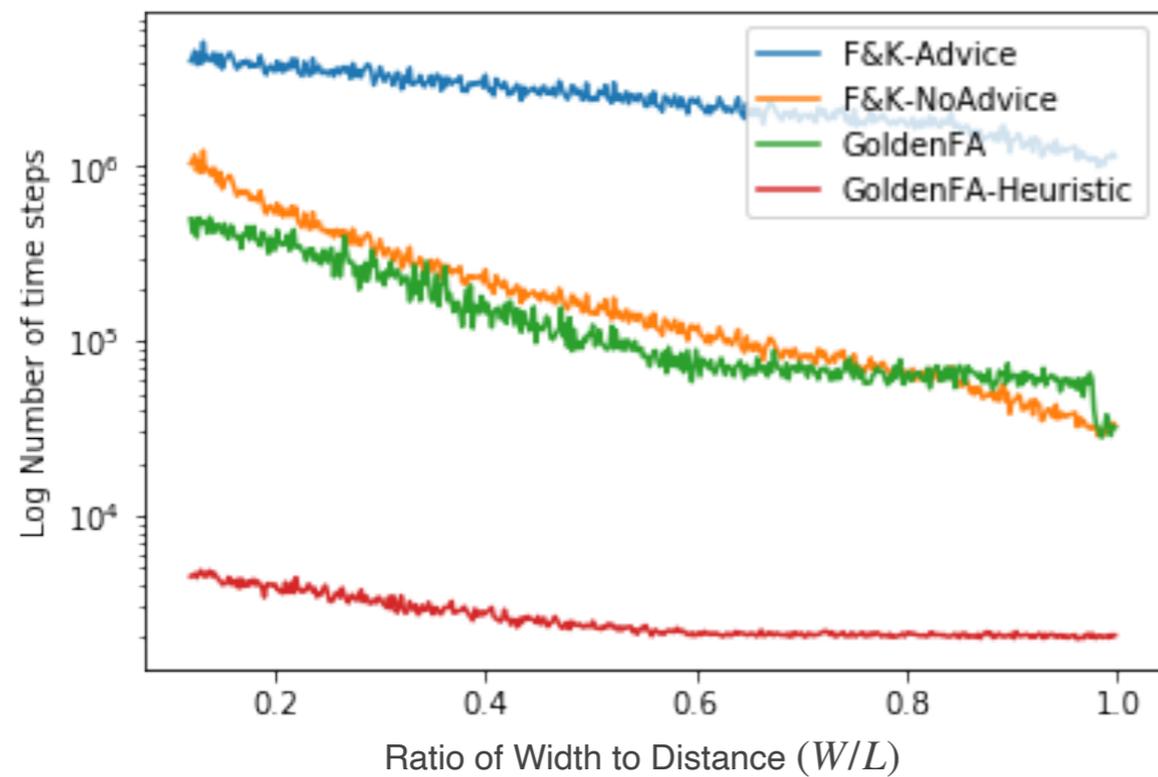
In epoch  $i$ , make  $\lceil c(1 + \alpha) \rceil$  spokes of length  $(1 + \alpha)^i$

$$c \leftarrow 1.9; \alpha \leftarrow 7$$

## F&K-NoAdvice:

$$\epsilon \leftarrow .01$$

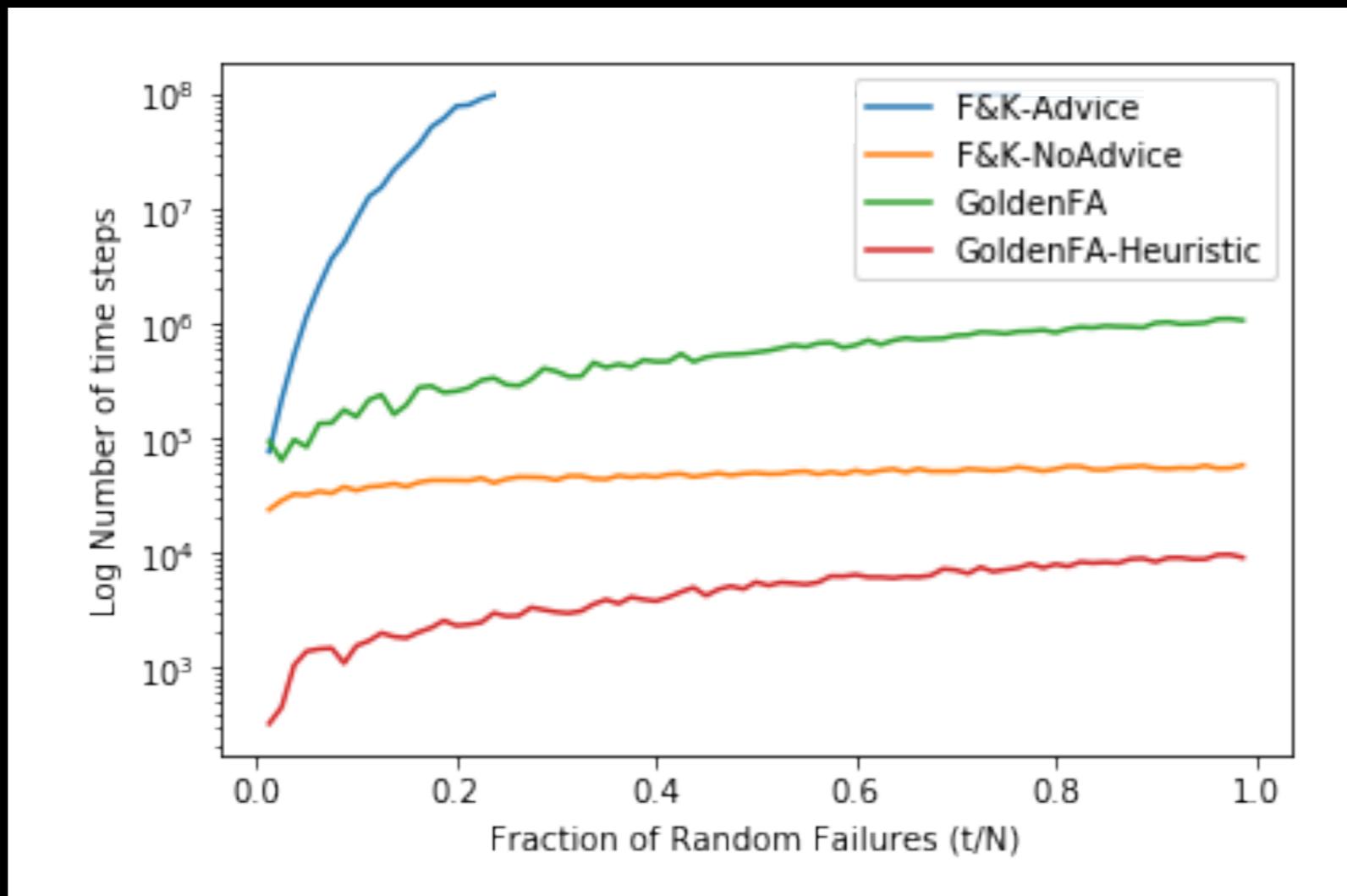
# Varying $W$ ; Varying $N$



$$L = 500; N = 1$$

$$L = 500; W = 4$$

# Faults



$$L = 500; D = 4; N = 100$$

Conclusion



**THAT'S IT**

**I'VE HAD IT WITH THESE**

!@#%\$@#!@#%!

**ANTS**

**ON THIS**

!@#%\$@#!@#%!

**PLANE**

meme-generator.net

# Results Recap

$L$  = target distance;  $W$  = target width;

$N$  = # agents;  $t$  = # faults

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Future Work

Get the %\$@#%! ANTS off the  
%\$@#%! plane

Get the %\$@#%! ANTS off the  
%\$@#%! plane

Theoretical Problem: Search in  $\mathbb{R}^3$

Get the %\$@#%! ANTS off the  
%\$@#%! plane

Theoretical Problem: Search in  $\mathbb{R}^3$

Practical Problem: Many searches have properties  
that simplify search along third dimension

Target Density

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Assume: Agent can sense local target density

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General Problem: Order statistics

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Problem 1: Efficiently estimate target mass

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Problem 2: Find max target density

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Gradient Descent

Questions?