

# Networked Computing

Distributed Graph Algorithms

# Outline

- Intro
  - What do we try to do
  - What this is not
- Coloring
  - $\Delta + 1$  colors
- The LOCAL model
- Coloring a ring
  - Color reduction
  - Lower bound

# Outline

- Intro
  - What do we try to do
  - What this is not
- Coloring
  - $\Delta + 1$  colors
- The LOCAL model
- Coloring a ring
  - Color reduction
  - Lower bound

## **Learning objectives:**

You are able to

- describe the LOCAL model of distributed computing
- describe the color reduction algorithm
- analyse the distributed complexity of 2-coloring a ring graph

# Message Passing





# The Internet



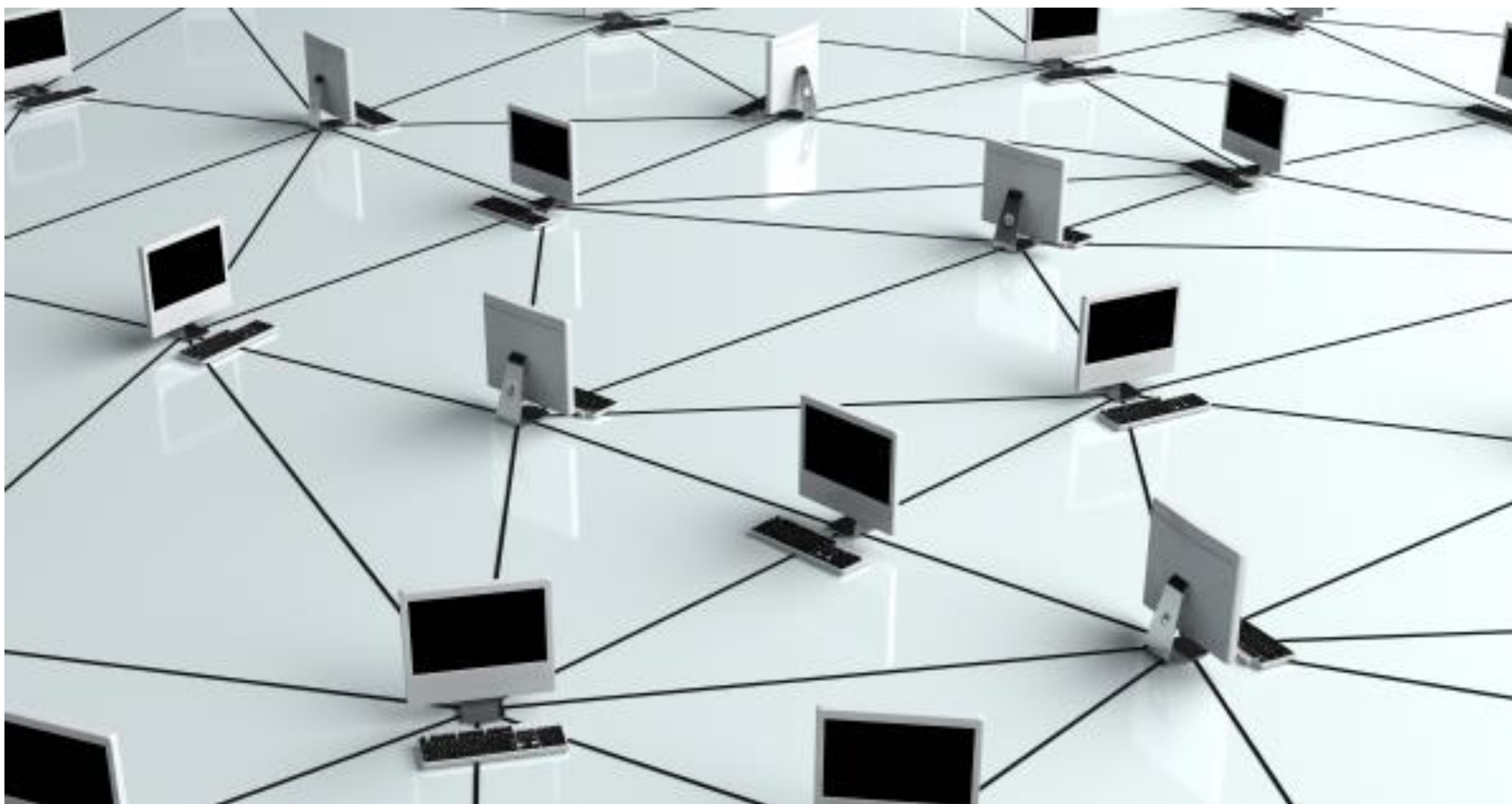


# Sensor Networks





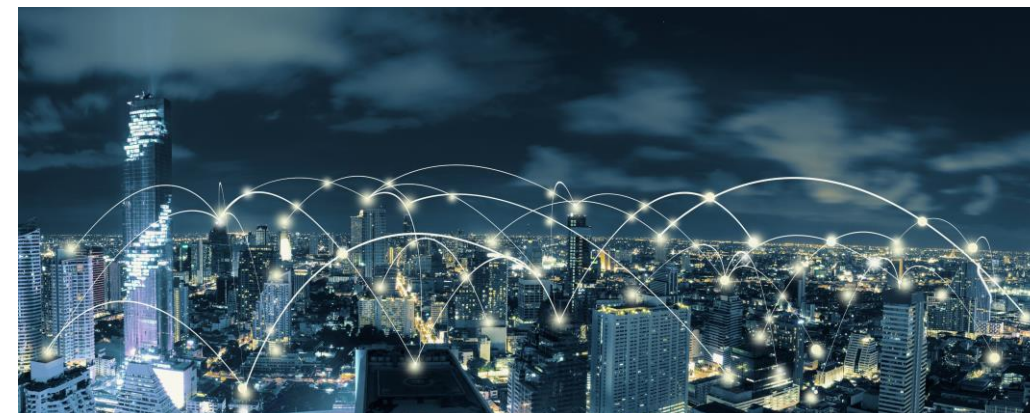
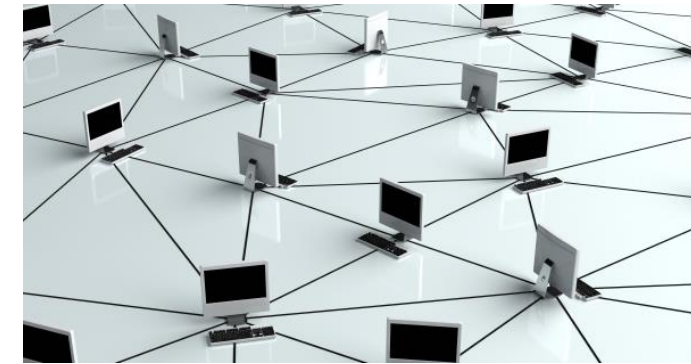
# Message Passing on a Graph



# Message Passing on a Graph

**Disclaimer:**

We are *modeling*  
networked computing.



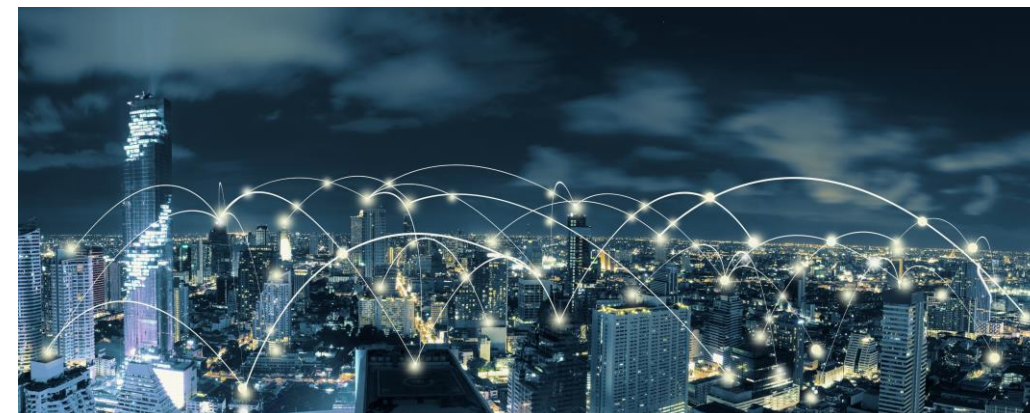
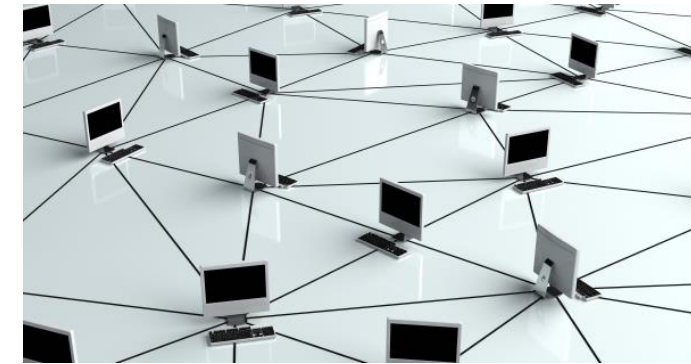


# Message Passing on a Graph

**Disclaimer:**

We are *modeling*  
networked computing.

Try to understand what  
is possible (and what is  
not)





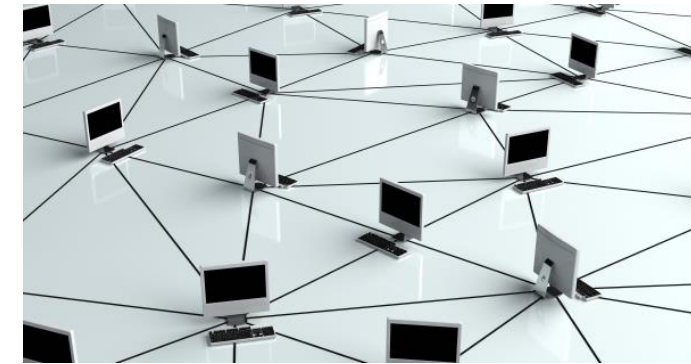
# Message Passing on a Graph

## **Disclaimer:**

We are *modeling* networked computing.

Try to understand what is possible (and what is not)

The goal is not to find algorithms for practice. Ideally, such algorithms get inspired by our findings



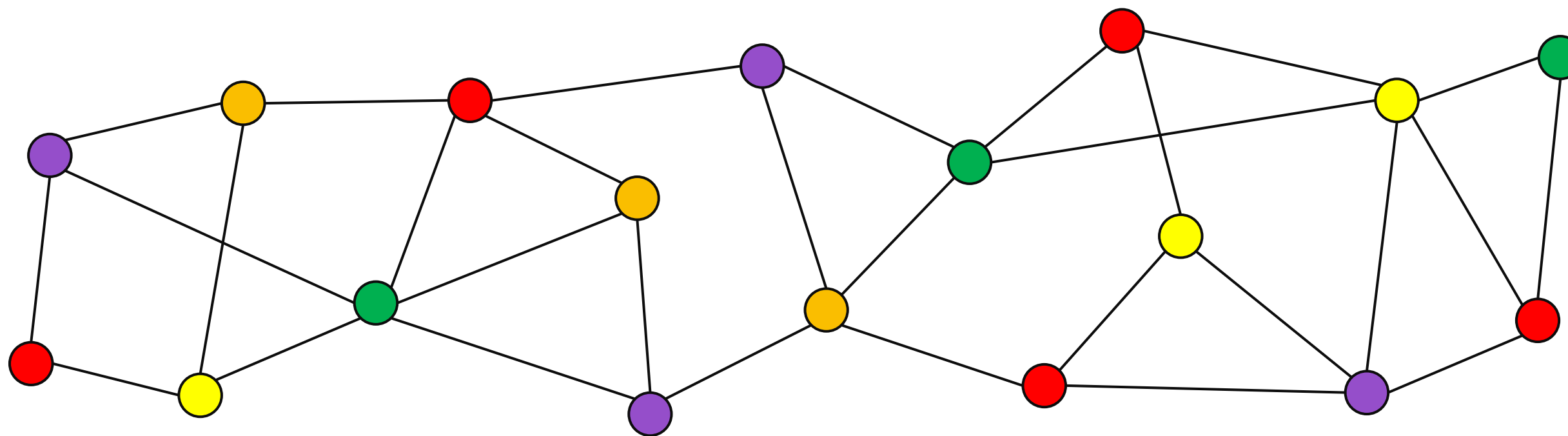


# Outline

- Intro
  - What do we try to do
  - What this is not
- Coloring
  - $\Delta + 1$  colors
- The LOCAL model
- Coloring a ring
  - Color reduction
  - Lower bound



# A Classic Problem: $(\Delta + 1)$ -Node-Coloring

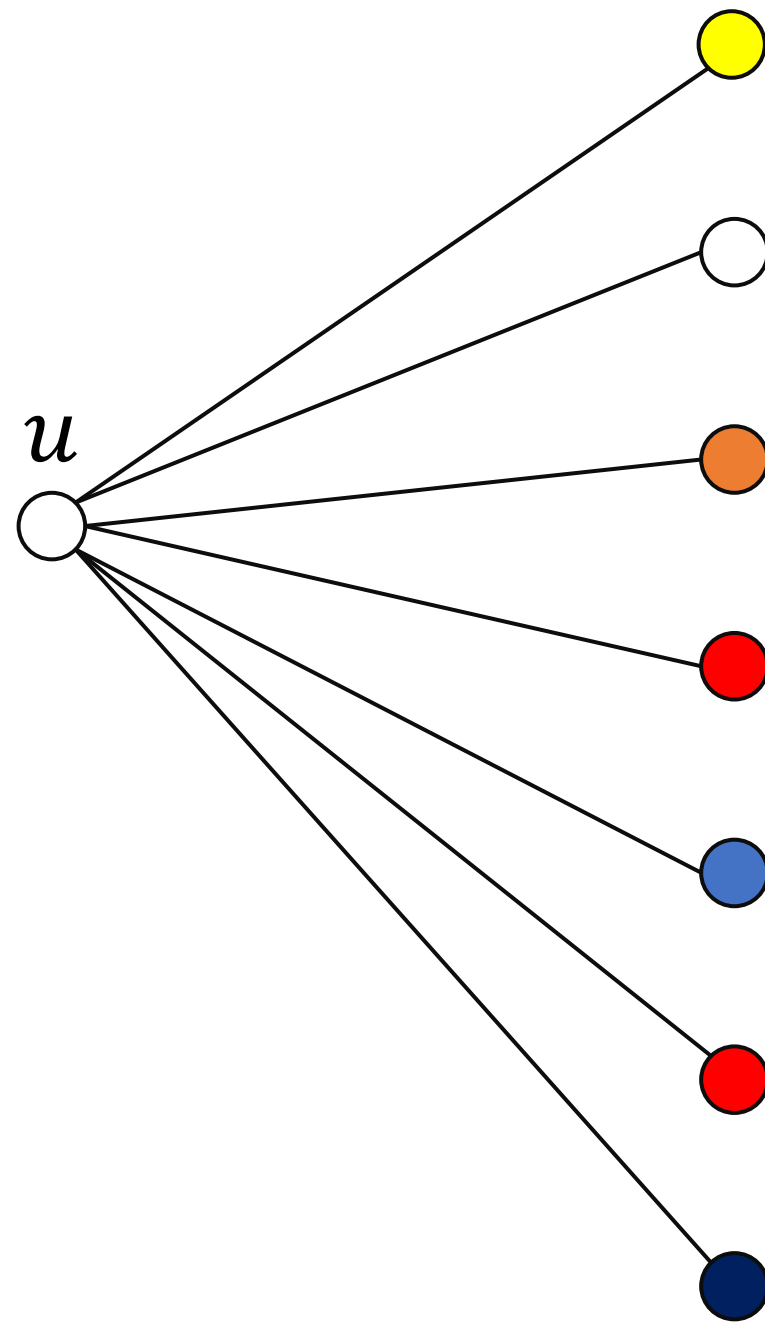


**Goal:** Color the nodes with at most  $\Delta + 1$  colors.

- Adjacent nodes have different colors.
- $\Delta$  is the maximum degree of the graph
- A greedy algorithm requires  $\Delta + 1$  colors.

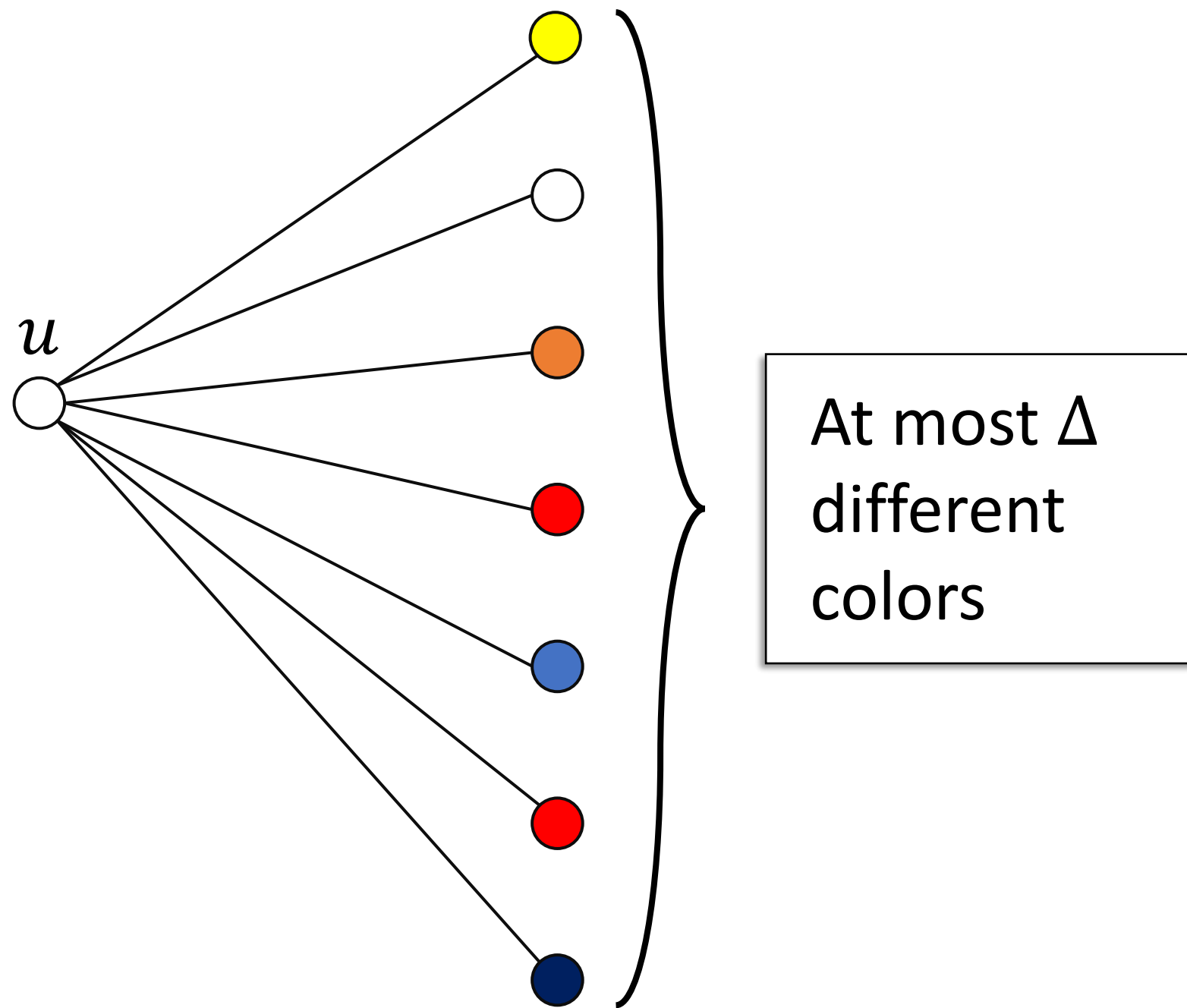


# A Classic Problem: $(\Delta + 1)$ -Node-Coloring



**Observation:**  $\Delta + 1$  colors always suffice

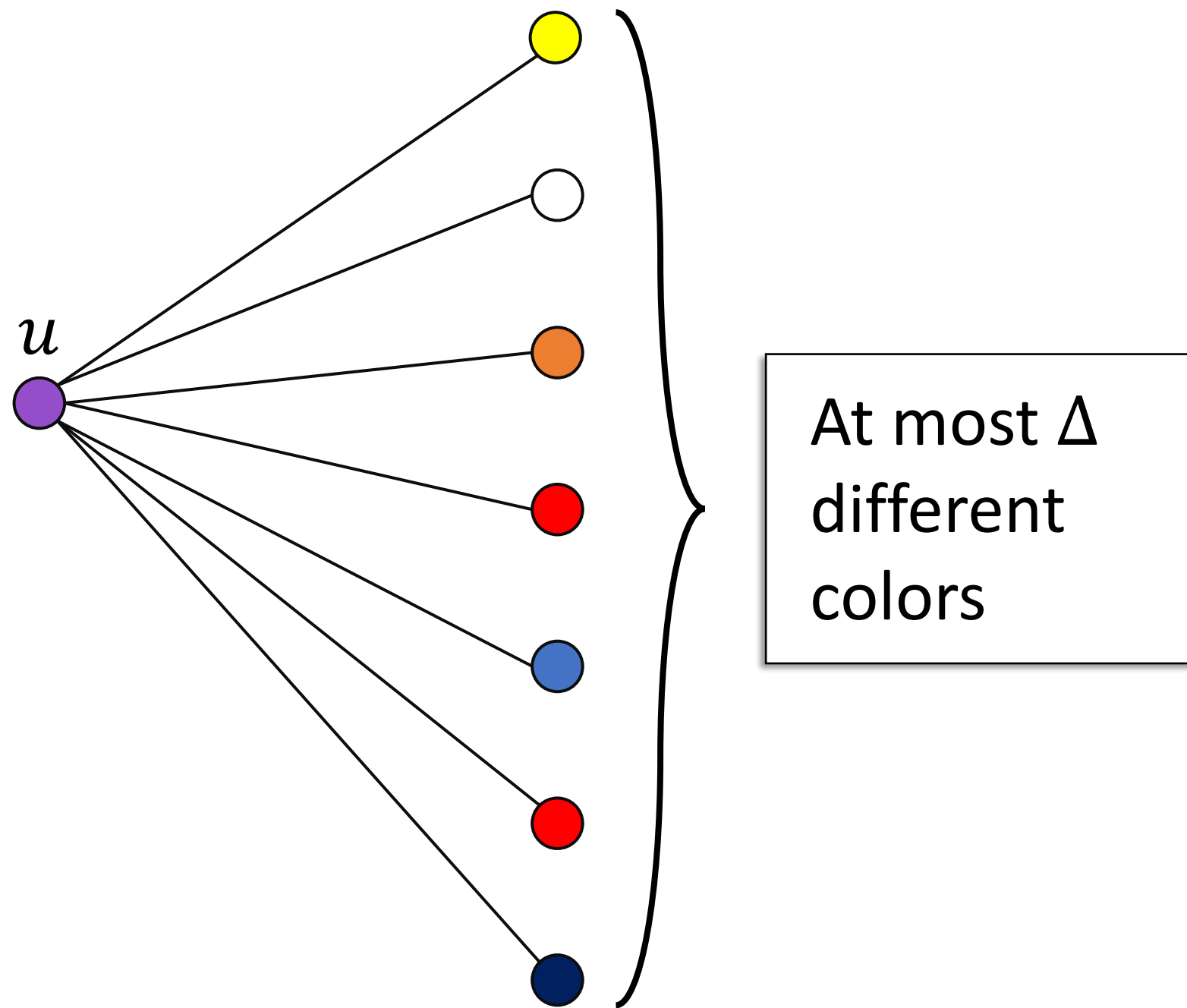
# A Classic Problem: $(\Delta + 1)$ -Node-Coloring



**Observation:**  $\Delta + 1$  colors always suffice

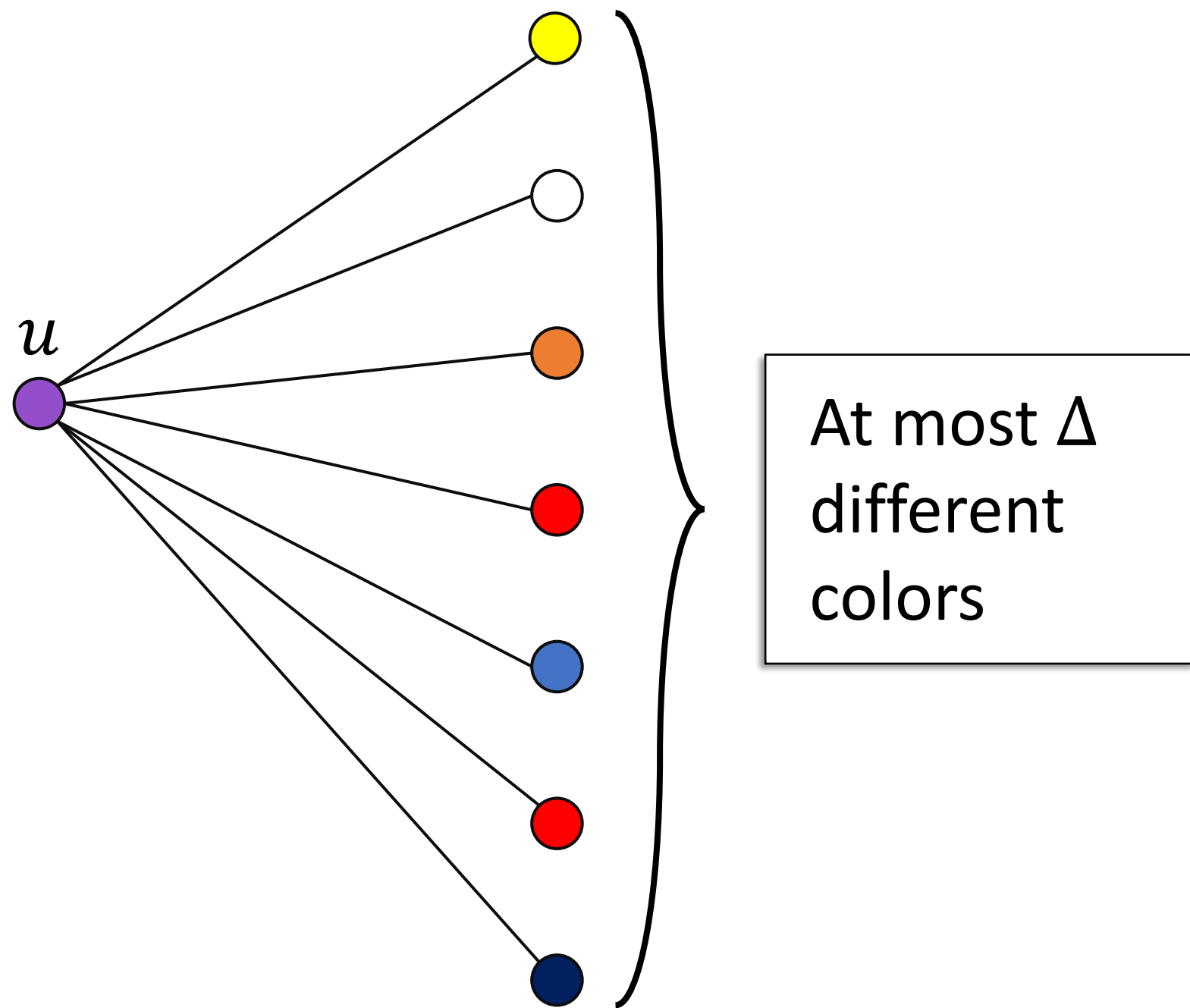


# A Classic Problem: $(\Delta + 1)$ -Node-Coloring



**Observation:**  $\Delta + 1$  colors always suffice

# A Classic Problem: $(\Delta + 1)$ -Node-Coloring



**Observation:**  $\Delta + 1$  colors always suffice

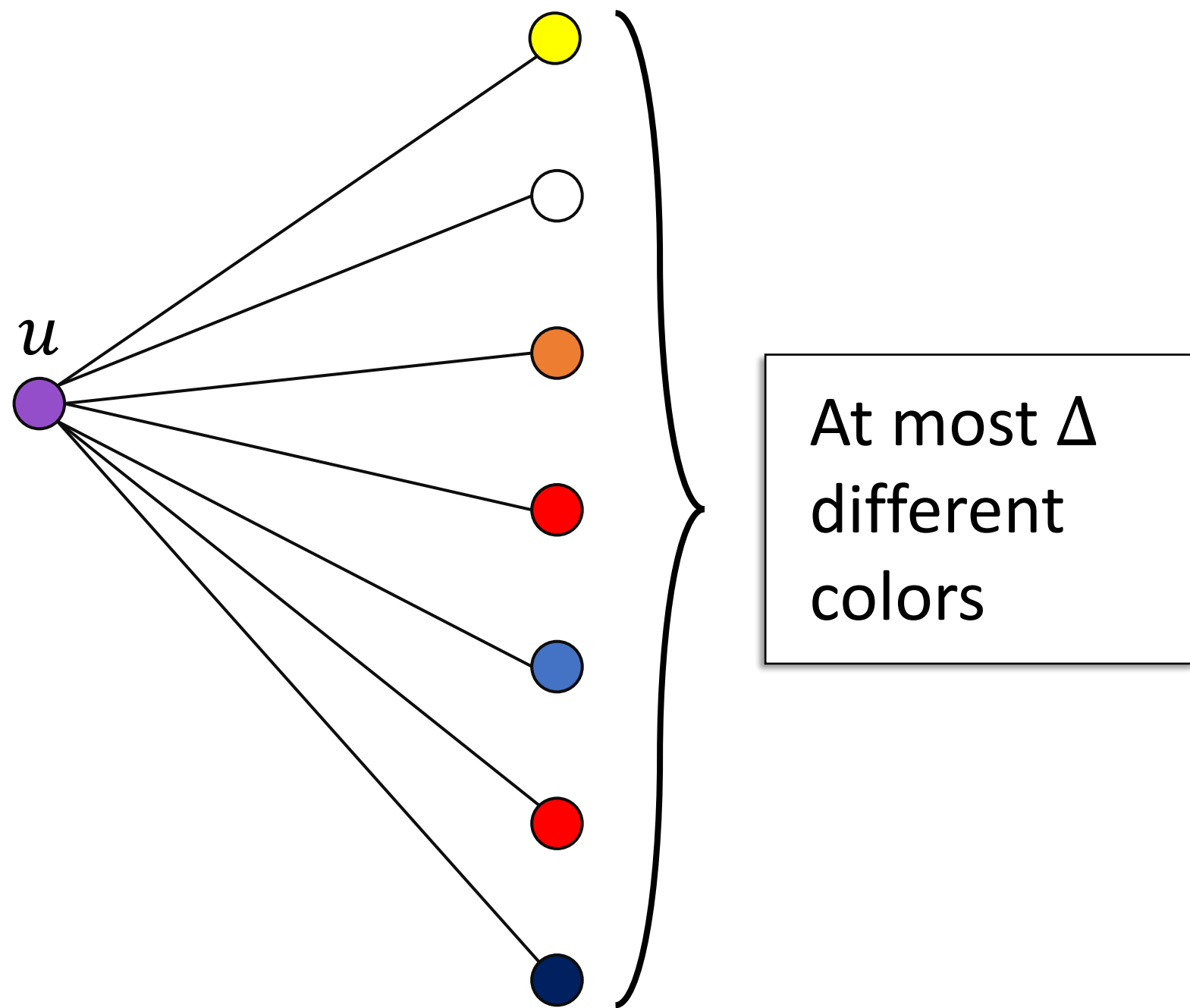
**Proof:**

Consider any partial  $(\Delta + 1)$ -coloring of the graph. Choose any node  $u$ . There is a free color for  $u$  to pick.

You can find a  $(\Delta + 1)$ -coloring with a greedy algorithm.



# A Classic Problem: $(\Delta + 1)$ -Node-Coloring



**Observation:**  $\Delta + 1$  colors always suffice

**Proof:**

Consider any **partial**  $(\Delta + 1)$ -coloring of the graph. Choose any node  $u$ . There is a free color for  $u$  to pick.

You can find a  $(\Delta + 1)$ -coloring with a greedy algorithm.

# Outline

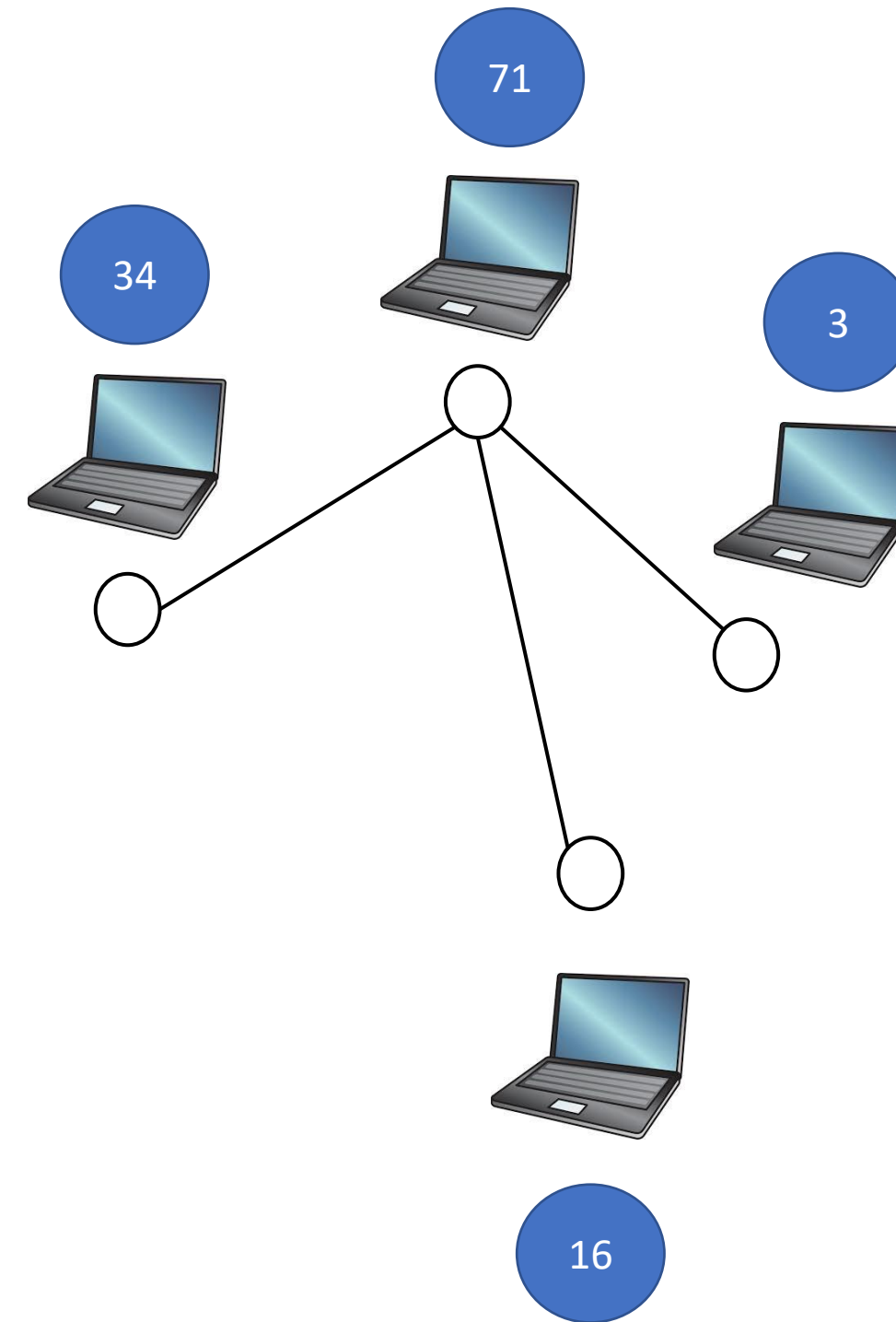
- Intro
  - What this is not
- Coloring
  - $\Delta + 1$  colors
- The LOCAL model
- Coloring a ring
  - Color reduction
  - Lower bound



# $(\Delta + 1)$ -Node-Coloring

**In the beginning:** Node only knows its own name and the names of its neighbors.

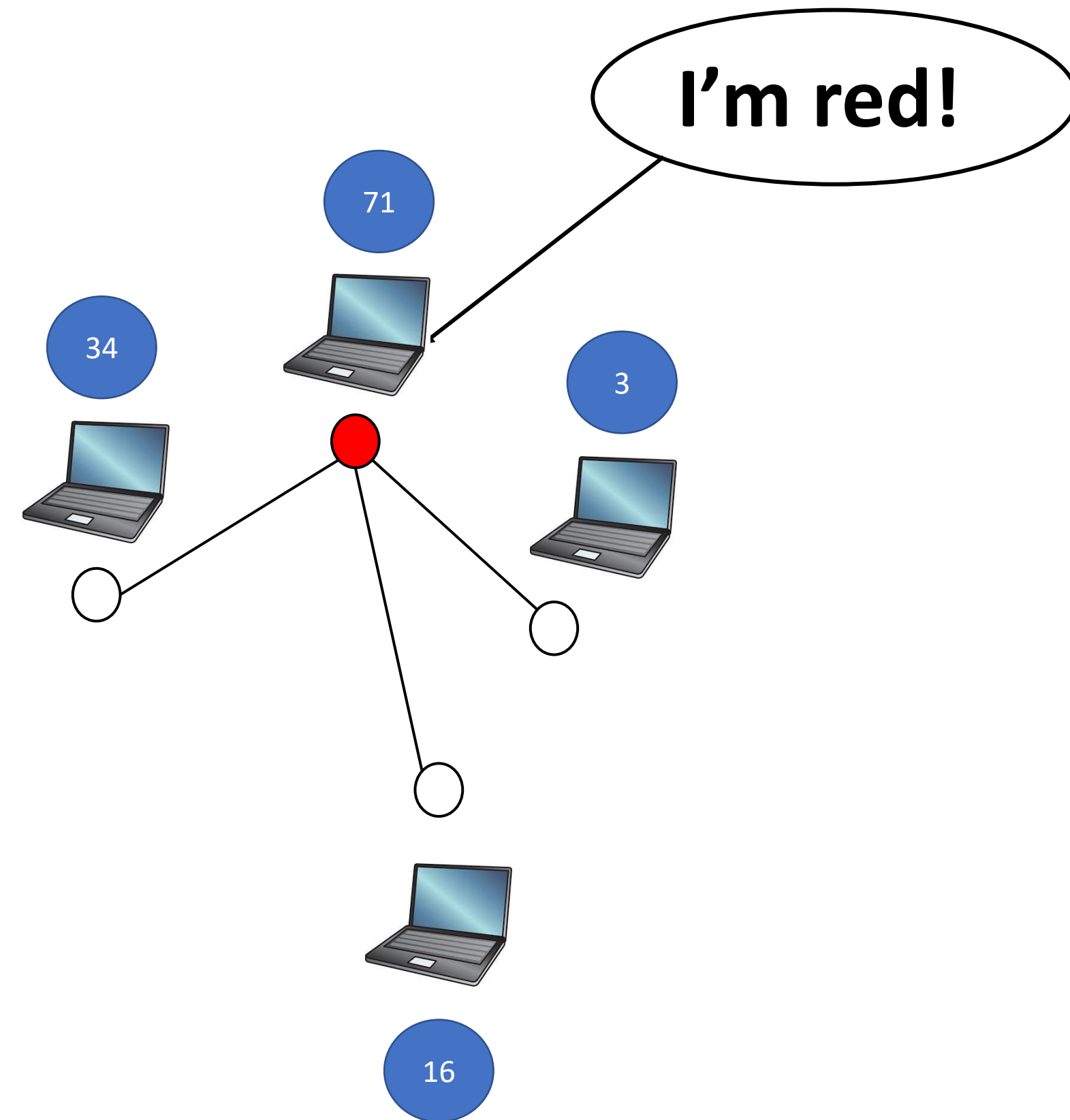
**In the end:** Node outputs its part of the solution, e.g., its color.



# $(\Delta + 1)$ -Node-Coloring

**In the beginning:** Node only knows its own name and the names of its neighbors.

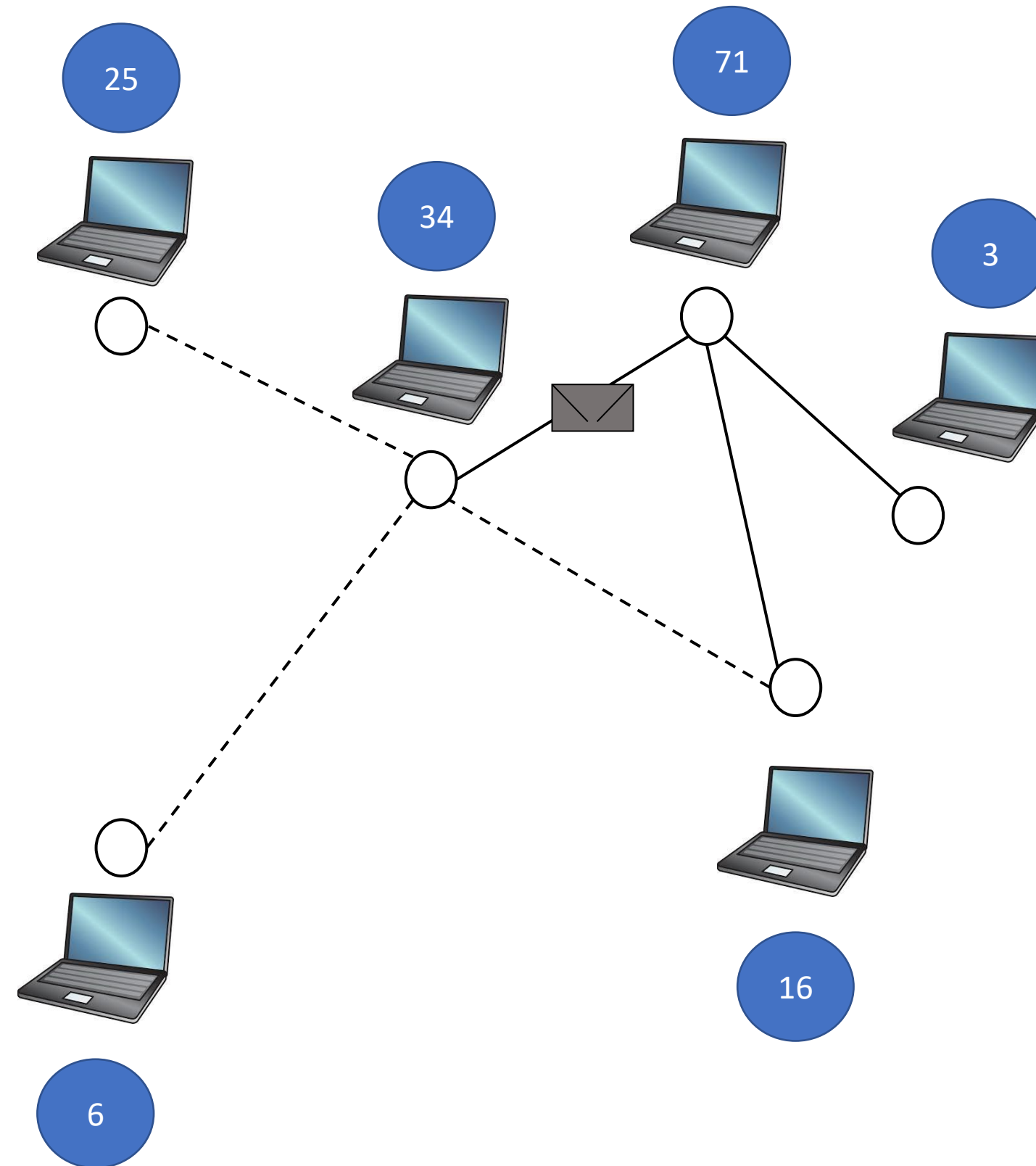
**In the end:** Node outputs its part of the solution, e.g., its color.





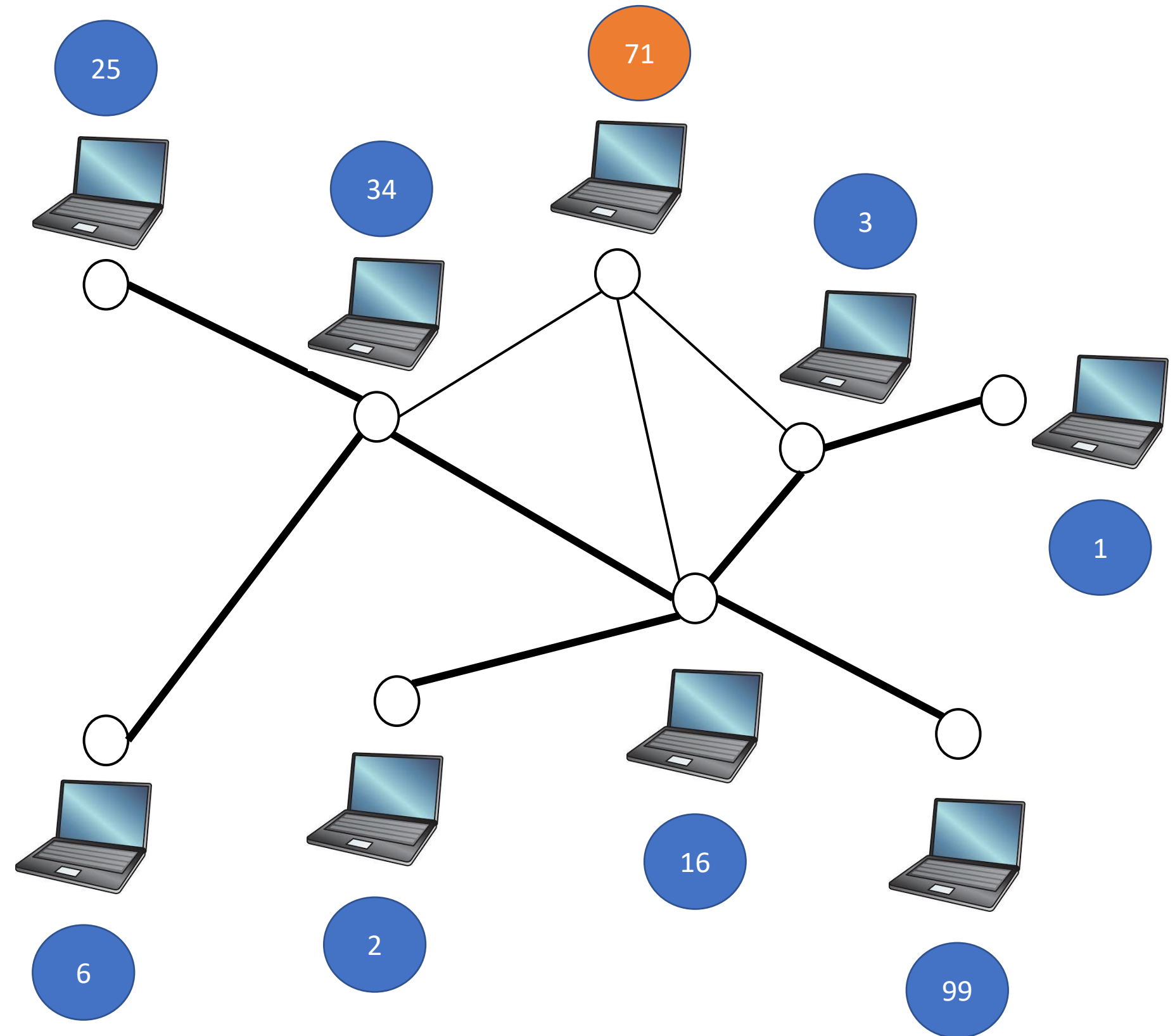
# $(\Delta + 1)$ -Node-Coloring

**A round:** Nodes can communicate along edges.



# $(\Delta + 1)$ -Node-Coloring

**Round 2:** Node can know the neighbors of neighbors.

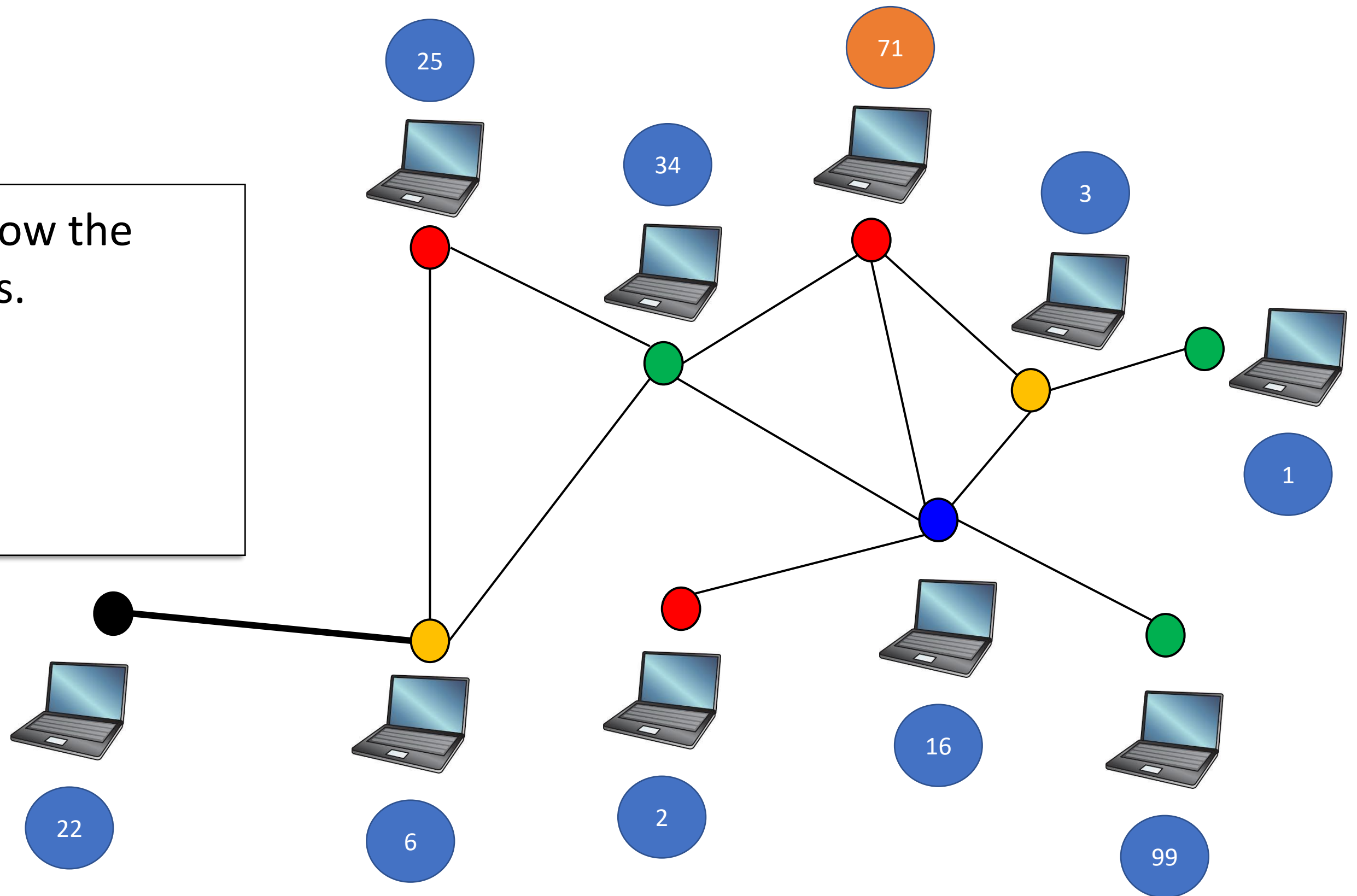


# $(\Delta + 1)$ -Node-Coloring

**Round 2:** Node can know the neighbors of neighbors.

**Round 3:**  $N^3(v)$

**Round  $i$ :**  $N^i(v)$





# The **LOCAL** Model of Distributed Computing

[Linial FOCS '87]

**We abstract away asynchrony,  
congestion, and local computations**

1. Synchronous rounds
2. Unlimited message sizes
3. Unlimited local computations

**Complexity: #rounds**

# The LOCAL Model of Distributed Computing

[Linial FOCS '87]

**We abstract away asynchrony,  
congestion, and local computations**

1. Synchronous rounds
2. Unlimited message sizes
3. Unlimited local computations

**Complexity: #rounds**

1. Receive message
2. Compute
3. Send messages

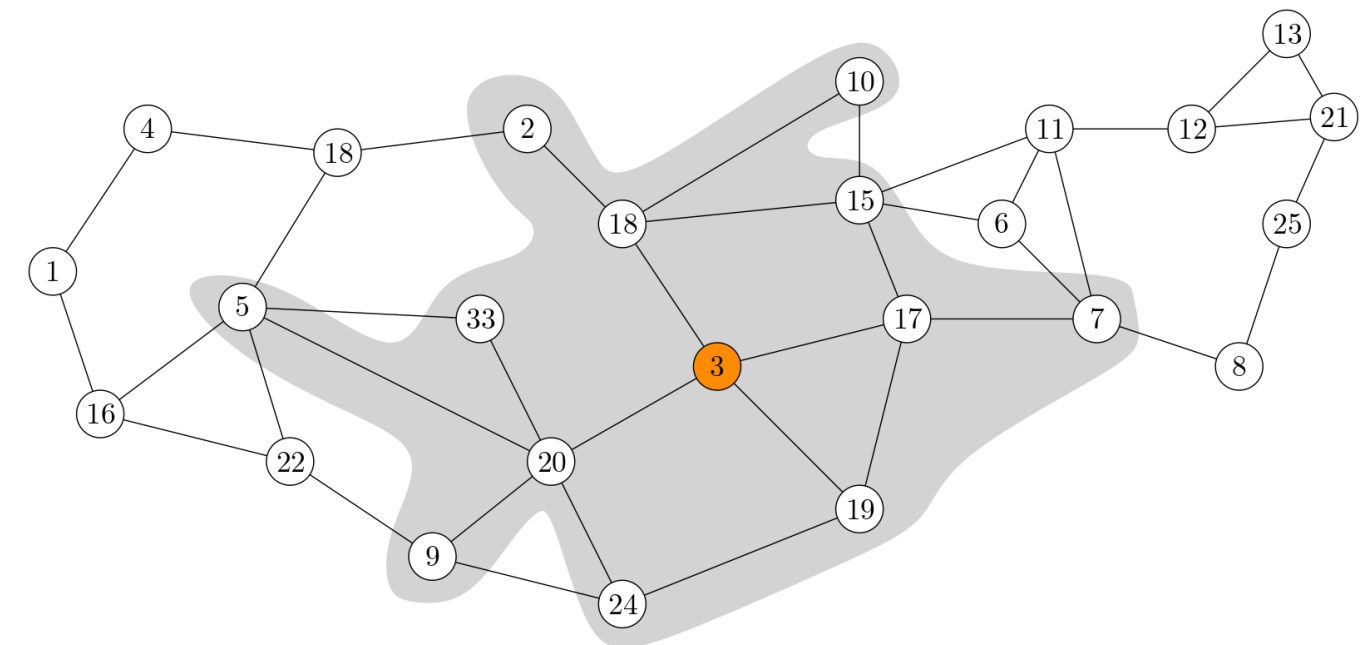
# The LOCAL Model of Distributed Computing

[Linial FOCS '87]

**We abstract away asynchrony,  
congestion, and local computations**

1. Synchronous rounds
2. Unlimited message sizes
3. Unlimited local computations

**Complexity: #rounds**



$N^t(v)$  = the topology of  $t$ -hop  
neighborhood and the  
 $O(\log n)$  bit **unique identifiers**.



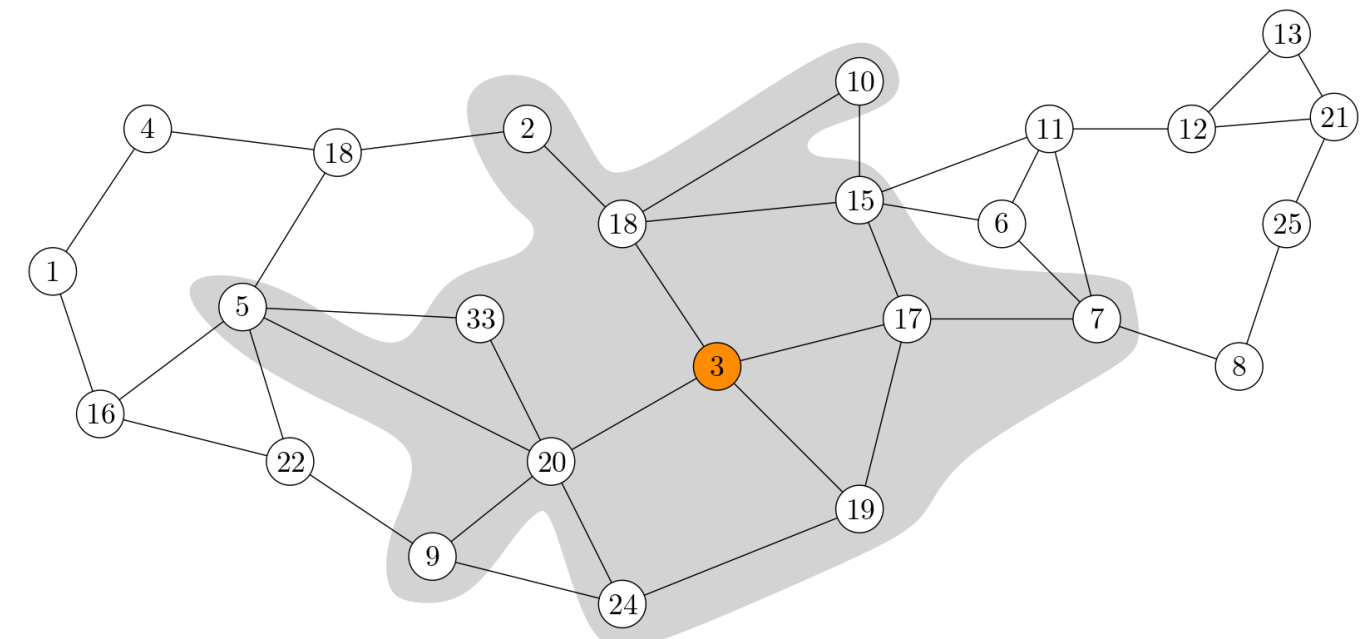
# The LOCAL Model of Distributed Computing

[Linial FOCS '87]

**We abstract away asynchrony, congestion, and local computations**

1. Synchronous rounds
2. Unlimited message sizes
3. Unlimited local computations

**Complexity: #rounds**



**A local distributed algorithm:**

$N^t(v) \rightarrow \text{output}$

If  $t = \text{diameter}$ , any problem solvable by brute force.

$N^t(v)$  = the topology of  $t$ -hop neighborhood and the **unique identifiers**.

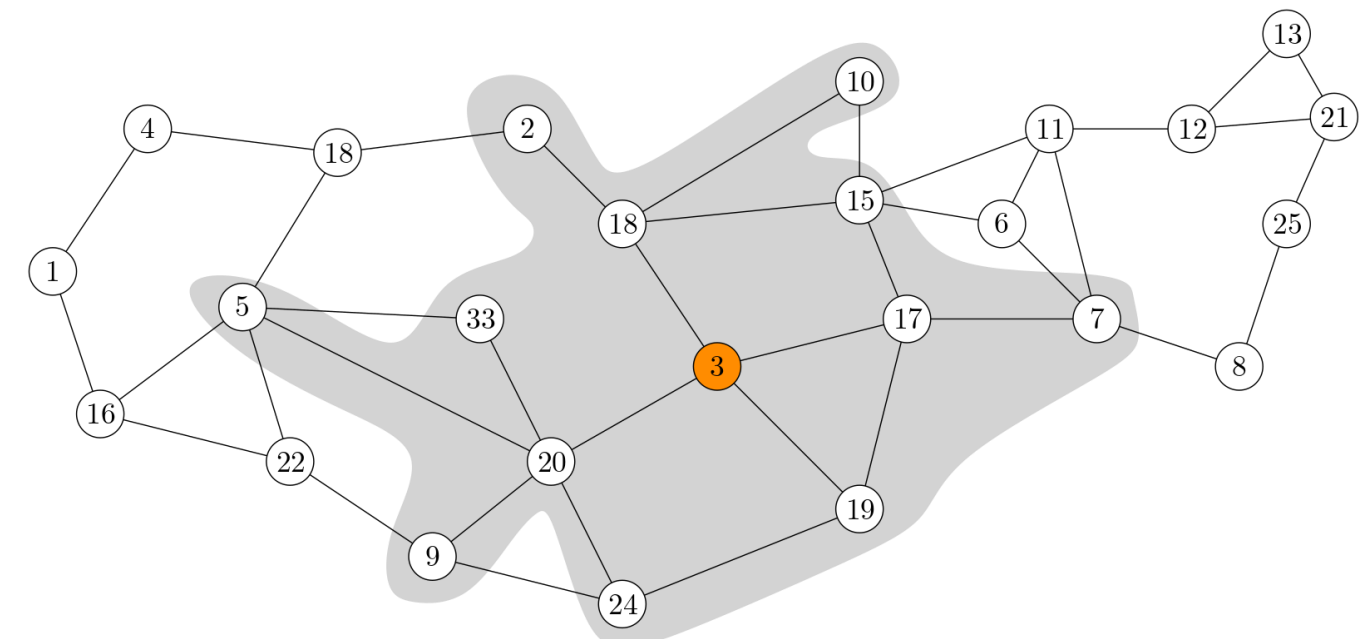
# The LOCAL Model of Distributed Computing

[Linial FOCS '87]

**We abstract away asynchrony, congestion, and local computations**

1. Synchronous rounds
2. Unlimited message sizes
3. Unlimited local computations

**Complexity: #rounds**



**A local distributed algorithm:**

$N^t(v) \rightarrow \text{output}$

If  $t = \text{diameter}$ , any problem solvable by brute force.

**Trivial algorithm:**

Gather all the information

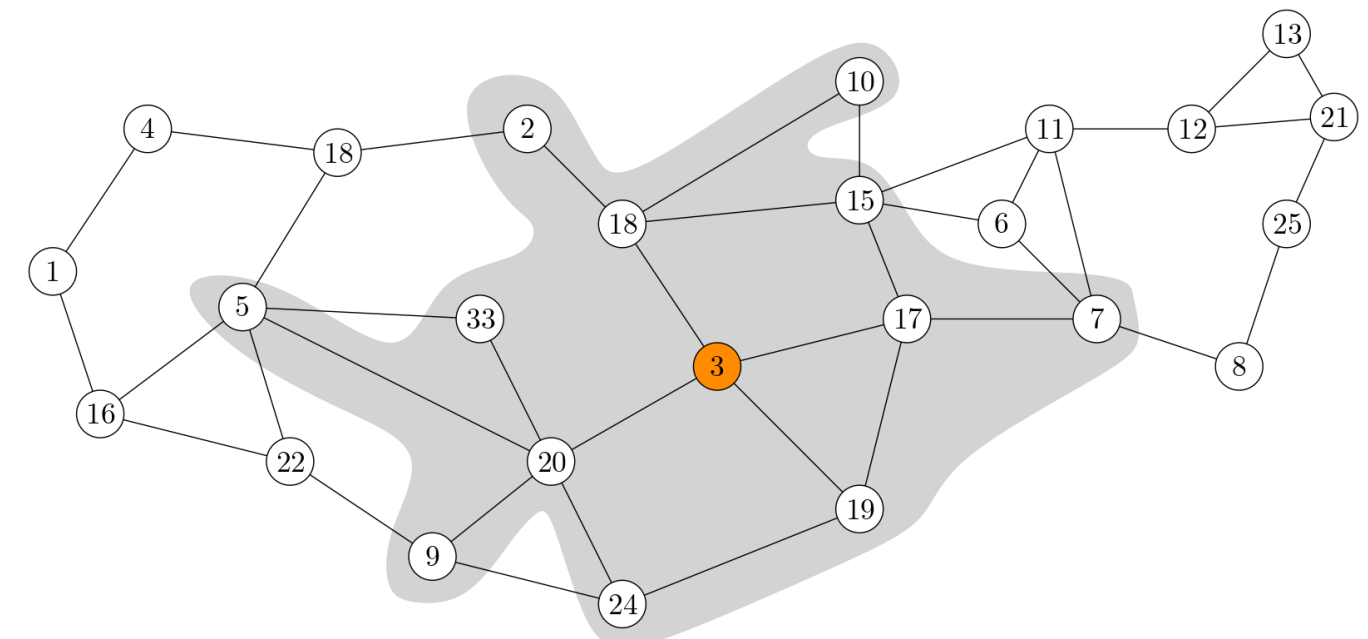
# The LOCAL Model of Distributed Computing

[Linial FOCS '87]

**We abstract away asynchrony, congestion, and local computations**

1. Synchronous rounds
2. Unlimited message sizes
3. Unlimited local computations

**Complexity: #rounds**



**A local distributed algorithm:**

$N^t(v) \rightarrow \text{output}$

If  $t = \text{diameter}$ , any problem solvable by brute force.

**Captures Locality:**

How far do we have to communicate?



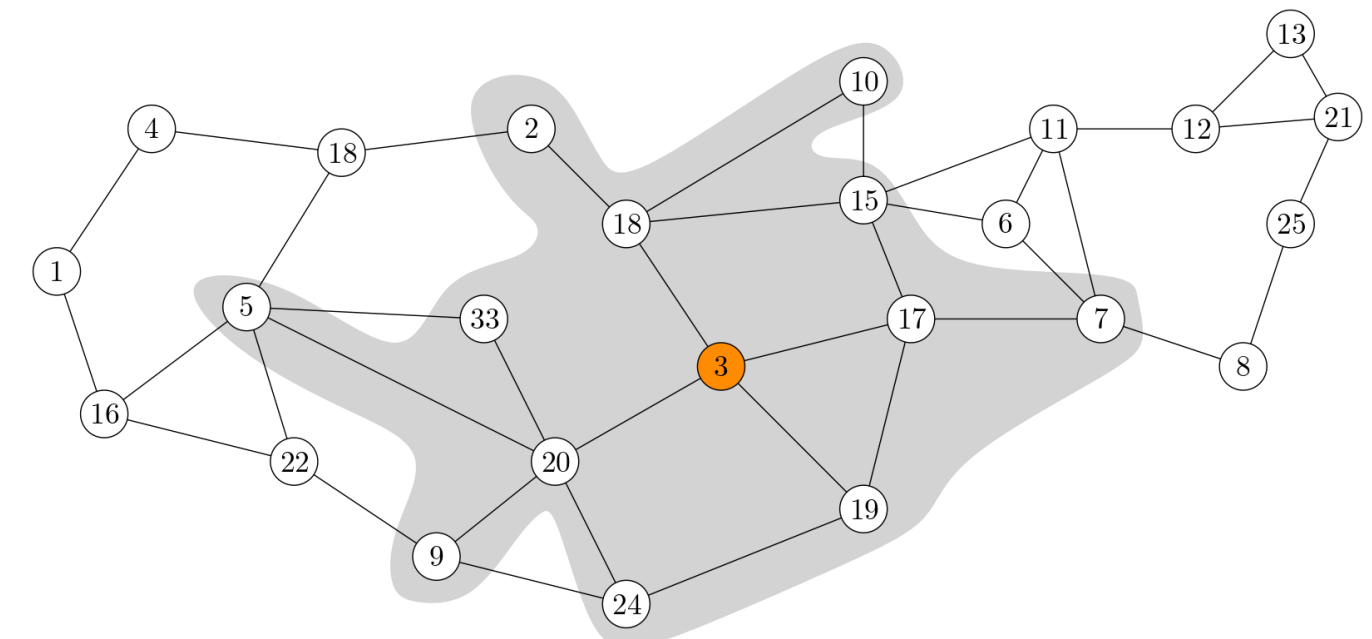
# The LOCAL Model of Distributed Computing

[Linial FOCS '87]

**We abstract away asynchrony, congestion, and local computations**

1. Synchronous rounds
2. Unlimited message sizes
3. Unlimited local computations

**Complexity: #rounds**



**Why?**

1. A very clean model
2. Information theoretic lower bounds!

**Much more in:**

CS-E4510 - Distributed Algorithms  
by Jukka Suomela

# Outline

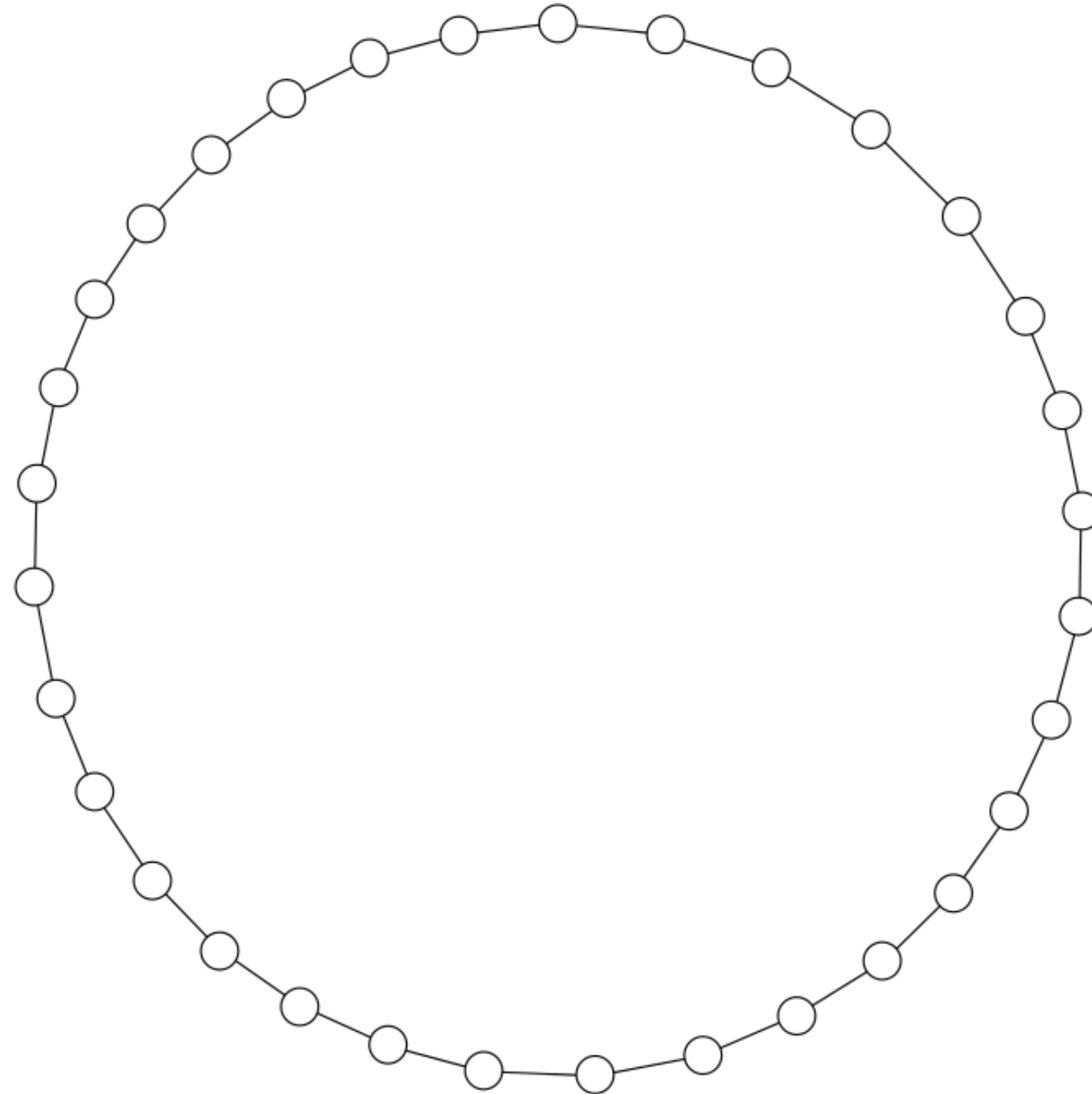
- Intro
  - What this is not
- Coloring
  - $\Delta + 1$  colors
- The LOCAL model
- Coloring a ring
  - Color reduction
  - Lower bound

# A Warm-Up Problem

**A warm-up problem:**

An  $n$ -node ring

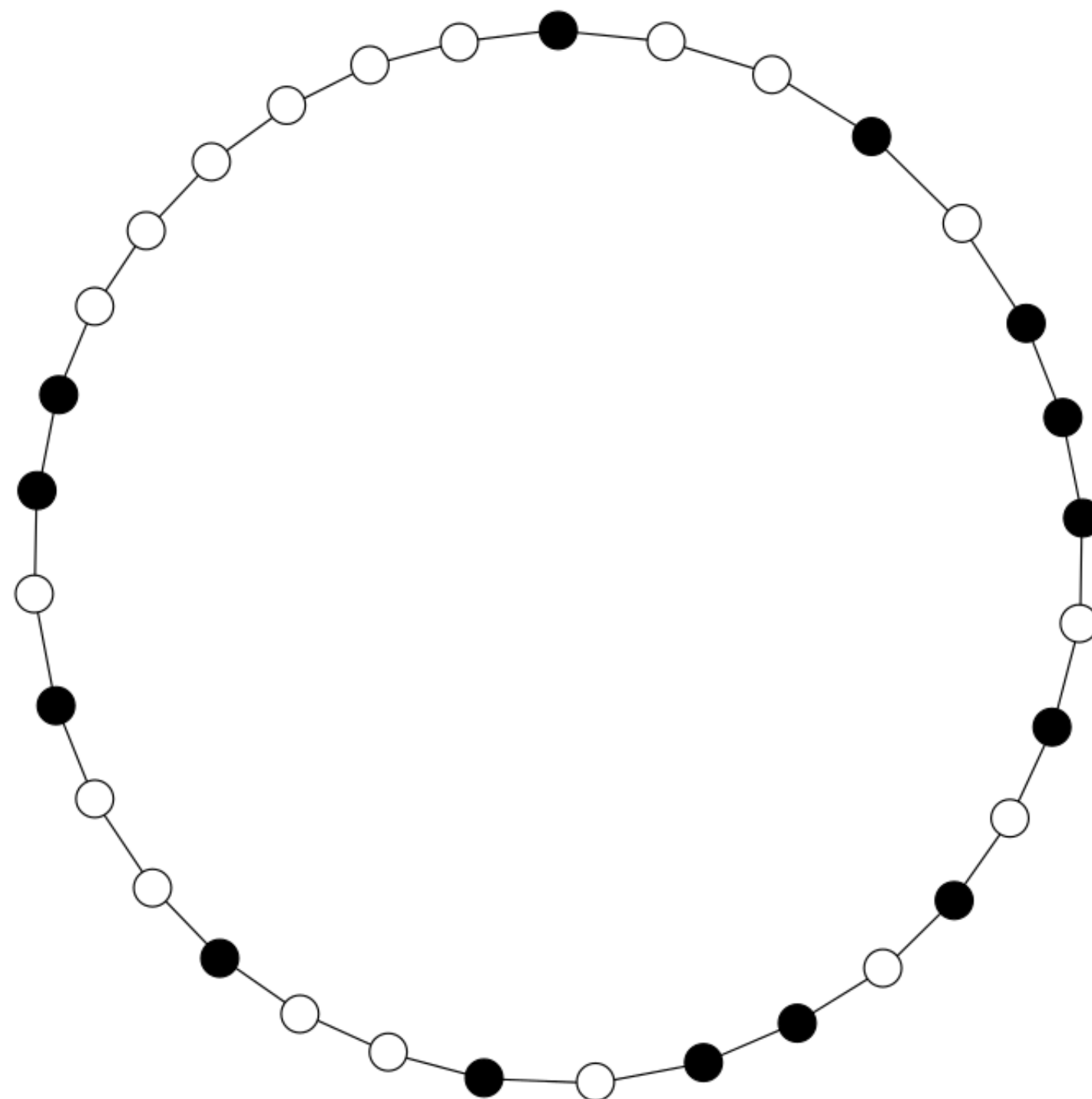
Find a 4-coloring



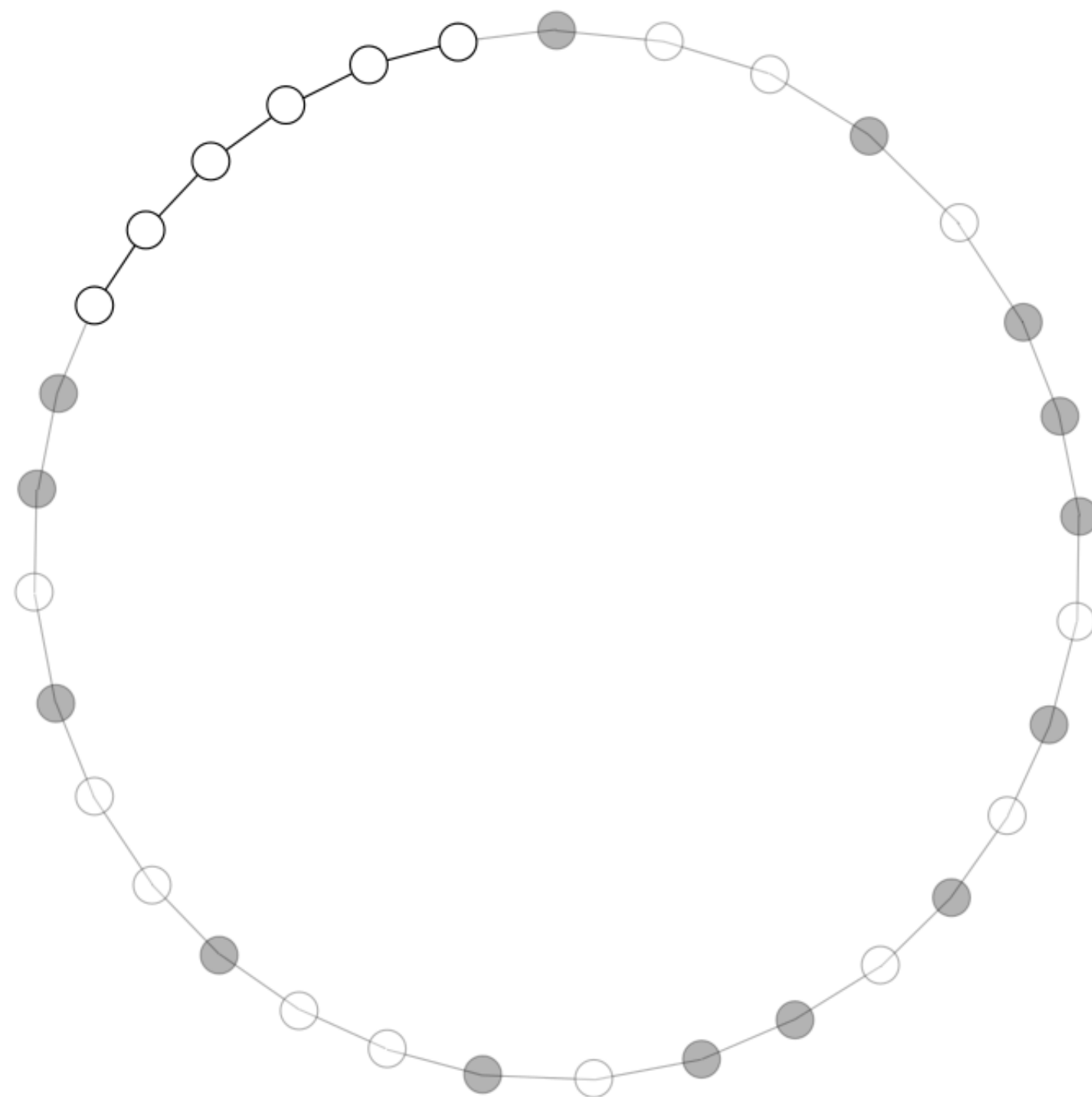


# A Warm-Up Problem

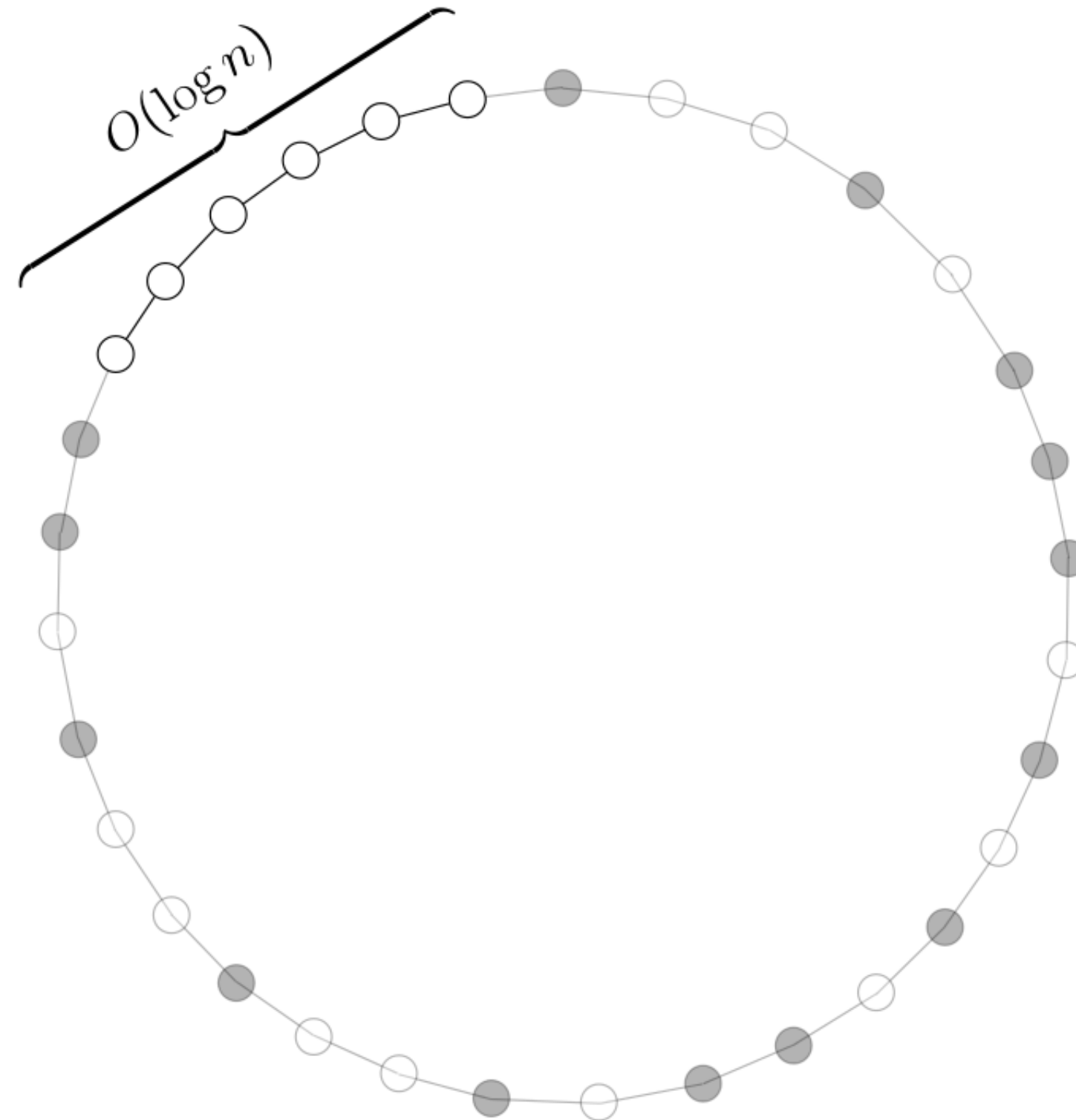
**Toss a fair coin.**  
Split into two parts



# A Warm-Up Problem



# A Warm-Up Problem

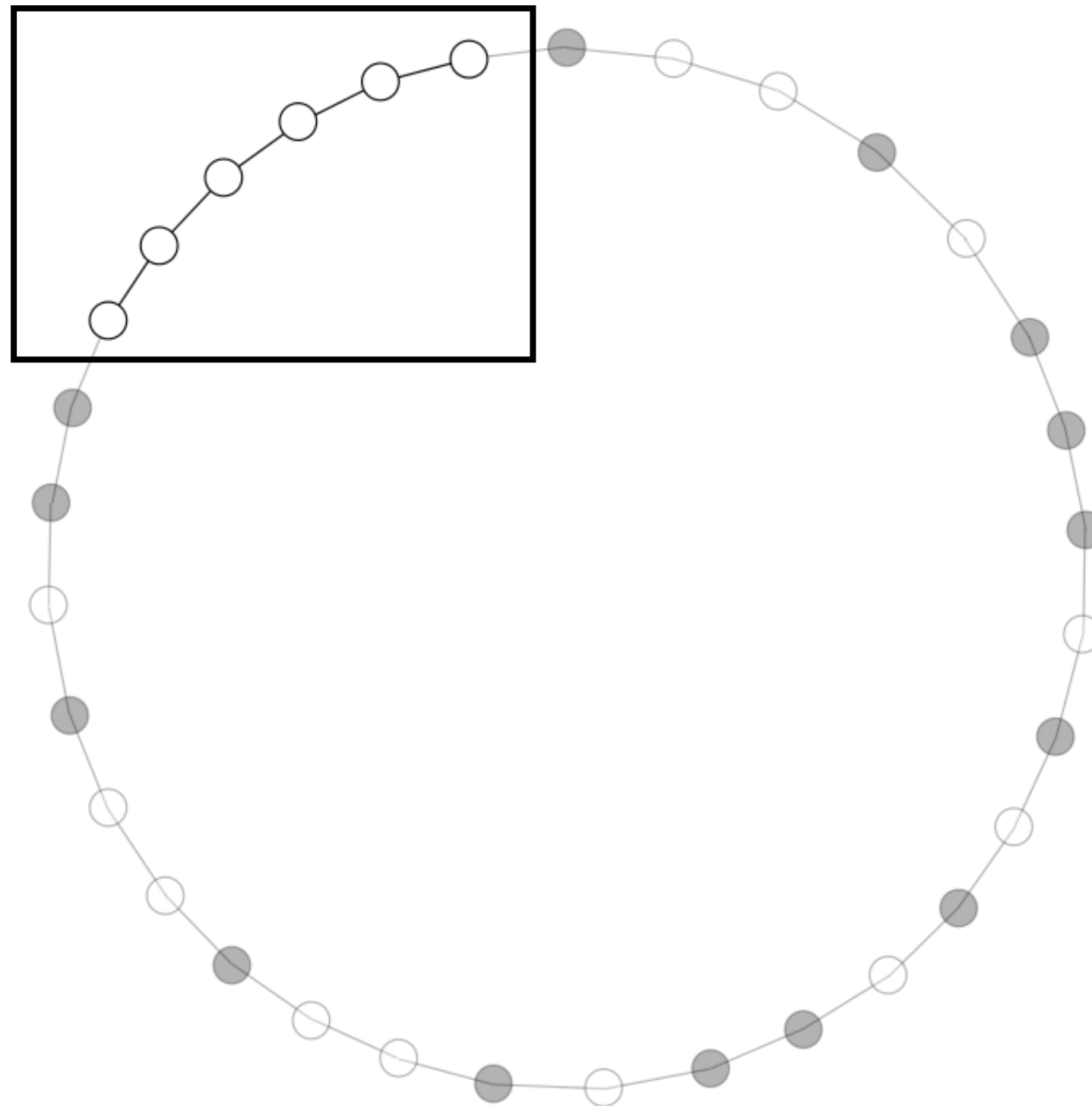


**Lemma:**  
Monochromatic parts  
are of length  $O(\log n)$   
with high probability  
 $1 - 1/n^c$

# A Warm-Up Problem

**Find a 2-coloring:**  
For example, by the  
trivial algorithm

Runtime:  $O(\log n)$



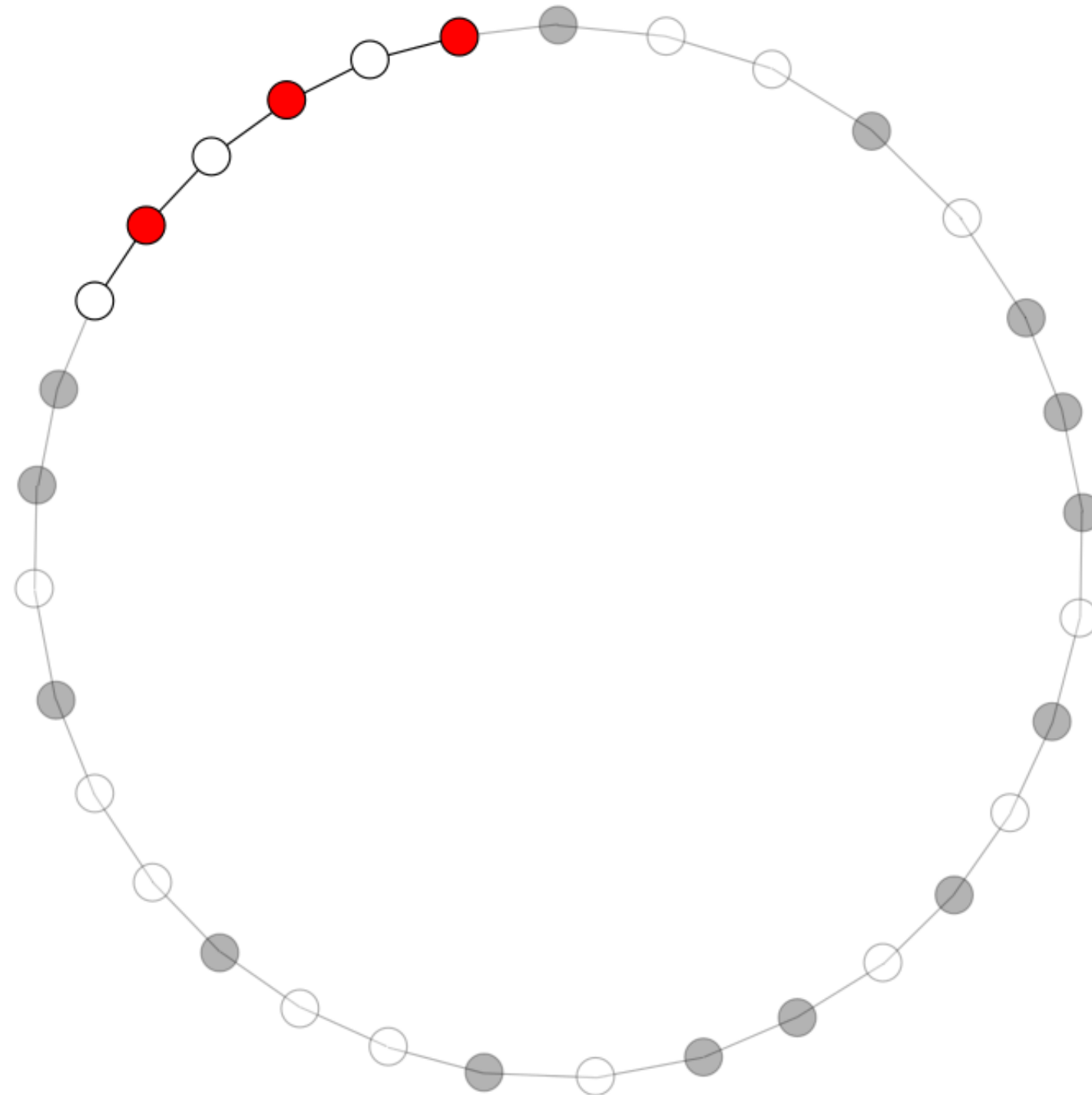
**Lemma:**  
Monochromatic parts  
are of length  $O(\log n)$   
with high probability  
 $1 - 1/n^c$



# A Warm-Up Problem

**White part:**  
Colors white/red

**Black part:**  
Colors black/blue

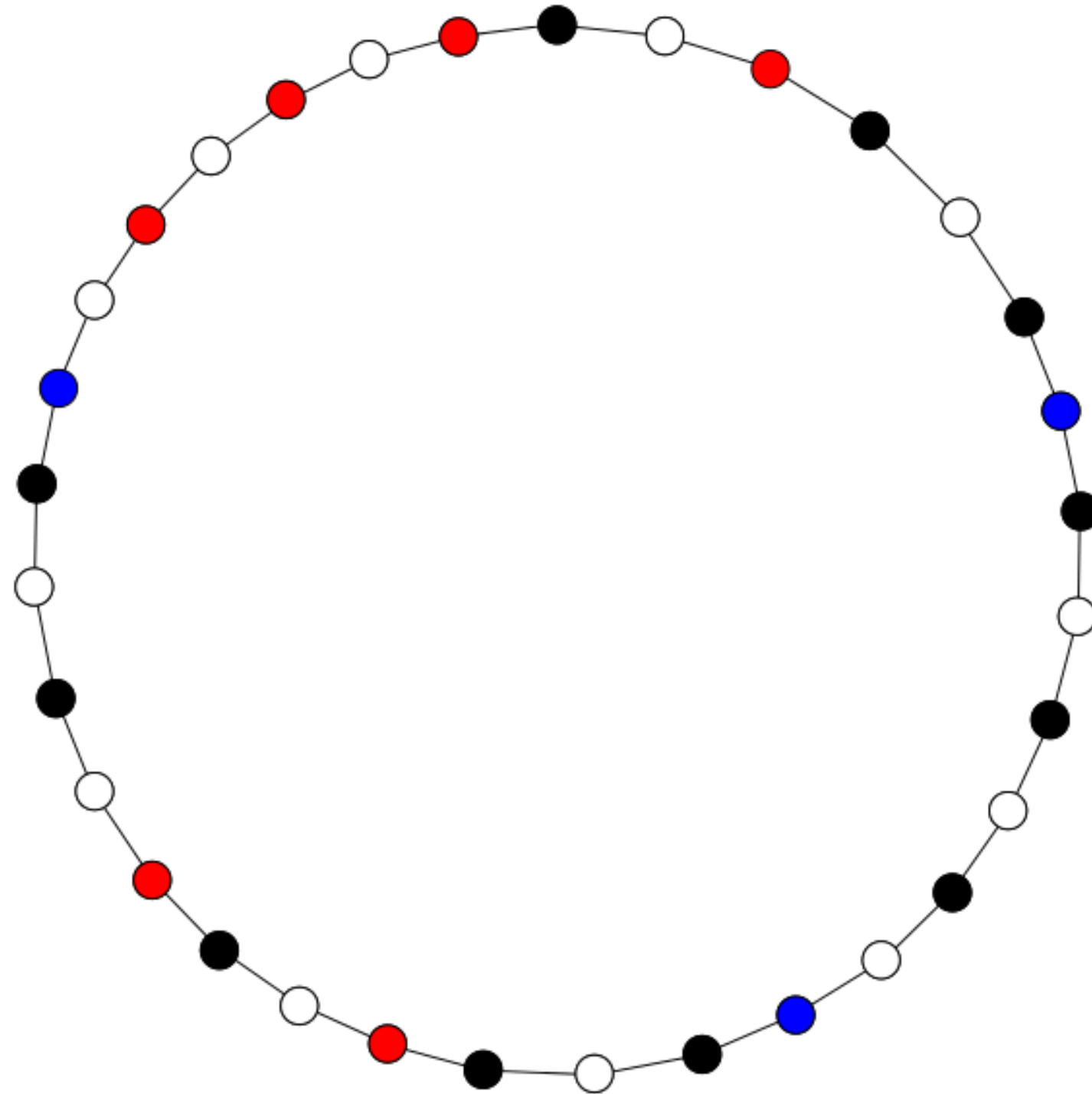


**Lemma:**  
Monochromatic parts  
are of length  $O(\log n)$   
with high probability  
 $1 - 1/n^c$

# A Warm-Up Problem

**White part:**  
Colors white/red

**Black part:**  
Colors black/blue



**Lemma:**  
Monochromatic parts  
are of length  $O(\log n)$   
with high probability  
 $1 - 1/n^c$

**Runtime:**  
 $O(\log n)$

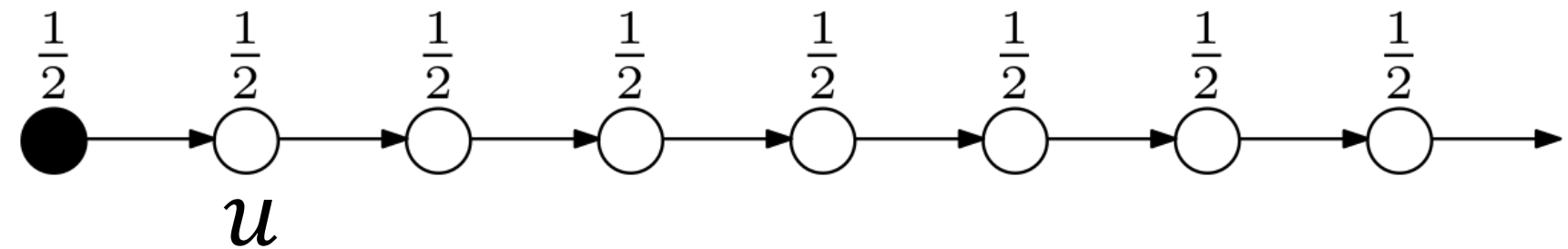
# A Warm-Up Problem

**Lemma:**

Monochromatic parts  
are of length  $O(\log n)$   
with high probability

$$1 - 1/n^c$$

Think of an  
oriented ring

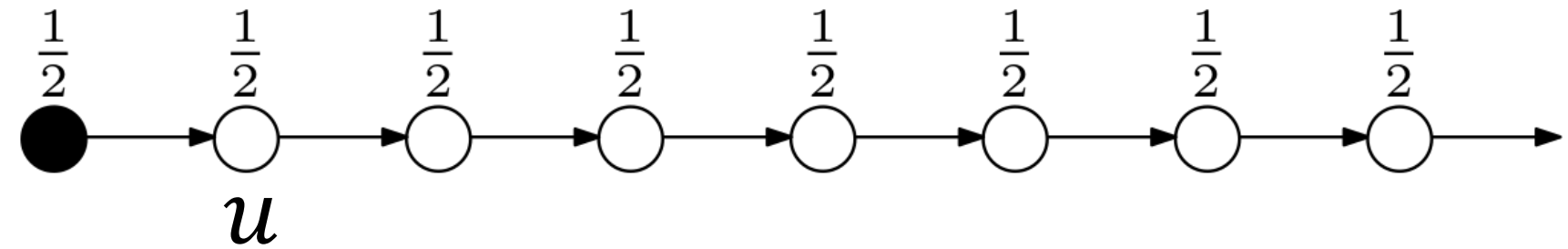


# A Warm-Up Problem

**Lemma:**

Monochromatic parts  
are of length  $O(\log n)$   
with high probability  
 $1 - 1/n^c$

Think of an  
oriented ring

**Event  $E(u)$ :**

A monochromatic path  
of length at least  $2c \log n$   
starts from  $u$

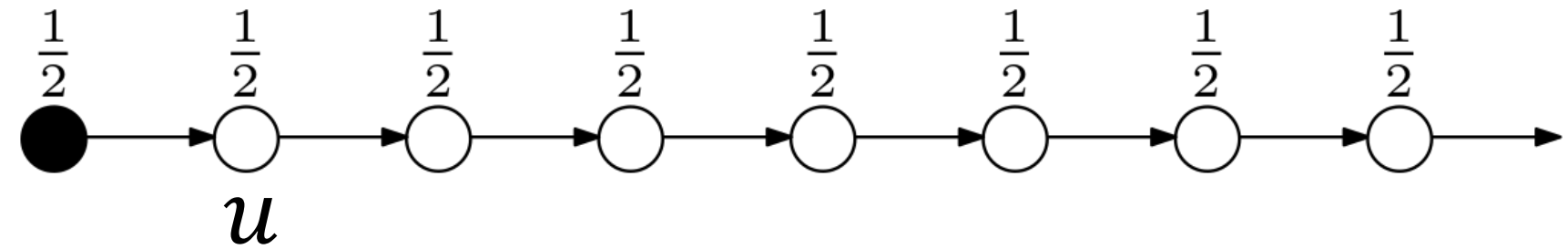


# A Warm-Up Problem

**Lemma:**

Monochromatic parts  
are of length  $O(\log n)$   
with high probability  
 $1 - 1/n^c$

Think of an  
oriented ring

**Event  $E(u)$ :**

A monochromatic path  
of length at least  $2c \log n$   
starts from  $u$

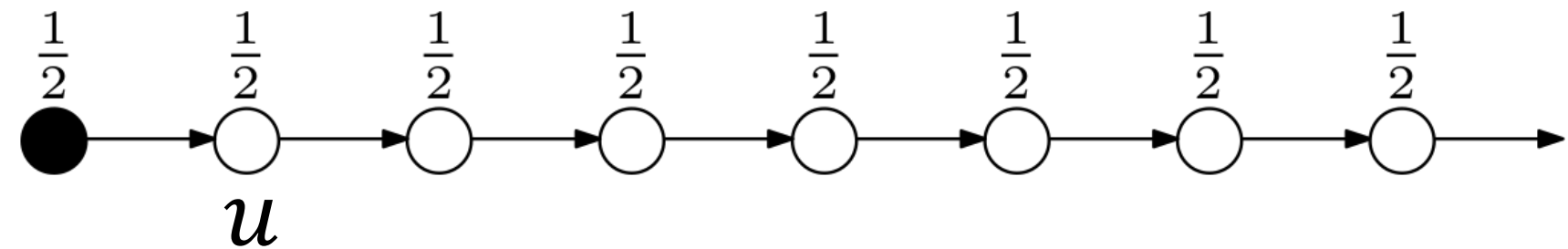
$$P(E(u)) \leq 2^{-(2c \log n)} = n^{-2c}$$

# A Warm-Up Problem

**Lemma:**

Monochromatic parts  
are of length  $O(\log n)$   
with high probability  
 $1 - 1/n^c$

Think of an  
oriented ring

**Event  $E(u)$ :**

A monochromatic path  
of length at least  $2c \log n$   
starts from  $u$

$$P(E(u)) \leq 2^{-(2c \log n)} = n^{-2c}$$

**Union bound:**

$$\sum_{u \in V} P(E(u)) \ll n^{-c}$$

# 4-Coloring a Ring

**Correctness:**

The graph is split into two disjoint parts.

The disjoint parts are colored with disjoint color palettes.

**Runtime (w.h.p.):**

Monochromatic parts are of length  $D = O(\log n)$  with high probability

$$1 - 1/n^c$$

Monochromatic parts are colored in parallel in time  $O(D)$ .

# Outline

- Intro
  - What this is not
- Coloring
  - $\Delta + 1$  colors
- The LOCAL model
- Coloring a ring
  - Color reduction
  - Lower bound



# 3-Coloring a Ring

**Color Reduction:**

Suppose you are *given* a coloring  $\mathcal{C}$  with  $q > \Delta + 1$  colors.

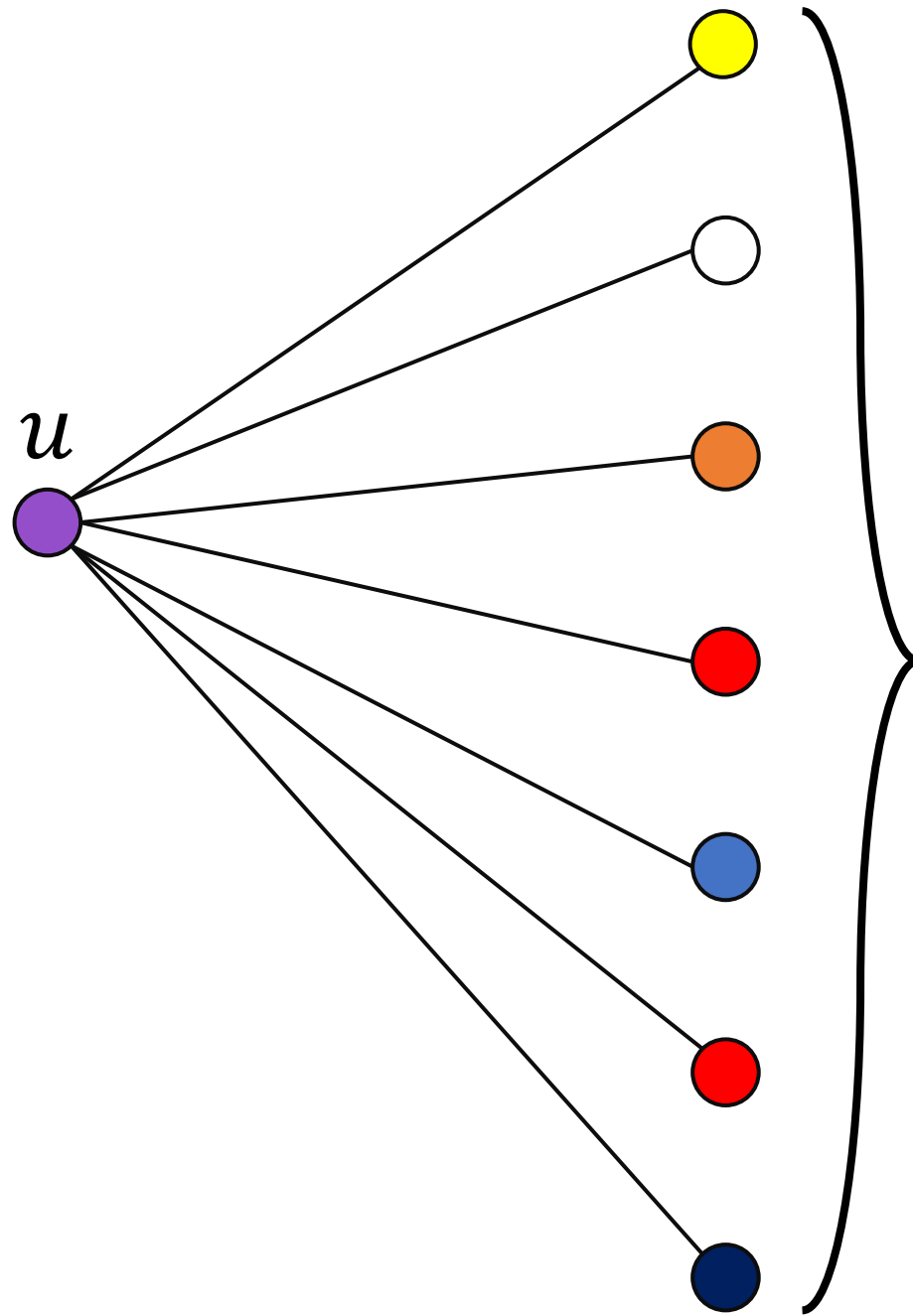
We can turn coloring  $\mathcal{C}$  into a  $(\Delta + 1)$ -coloring in  $O(q)$  rounds.

**Algorithm:**

Iterate over the  $q$  colors, from highest to lowest.

Always pick the smallest free color.

# 3-Coloring a Ring



At most  $\Delta$   
different colors.

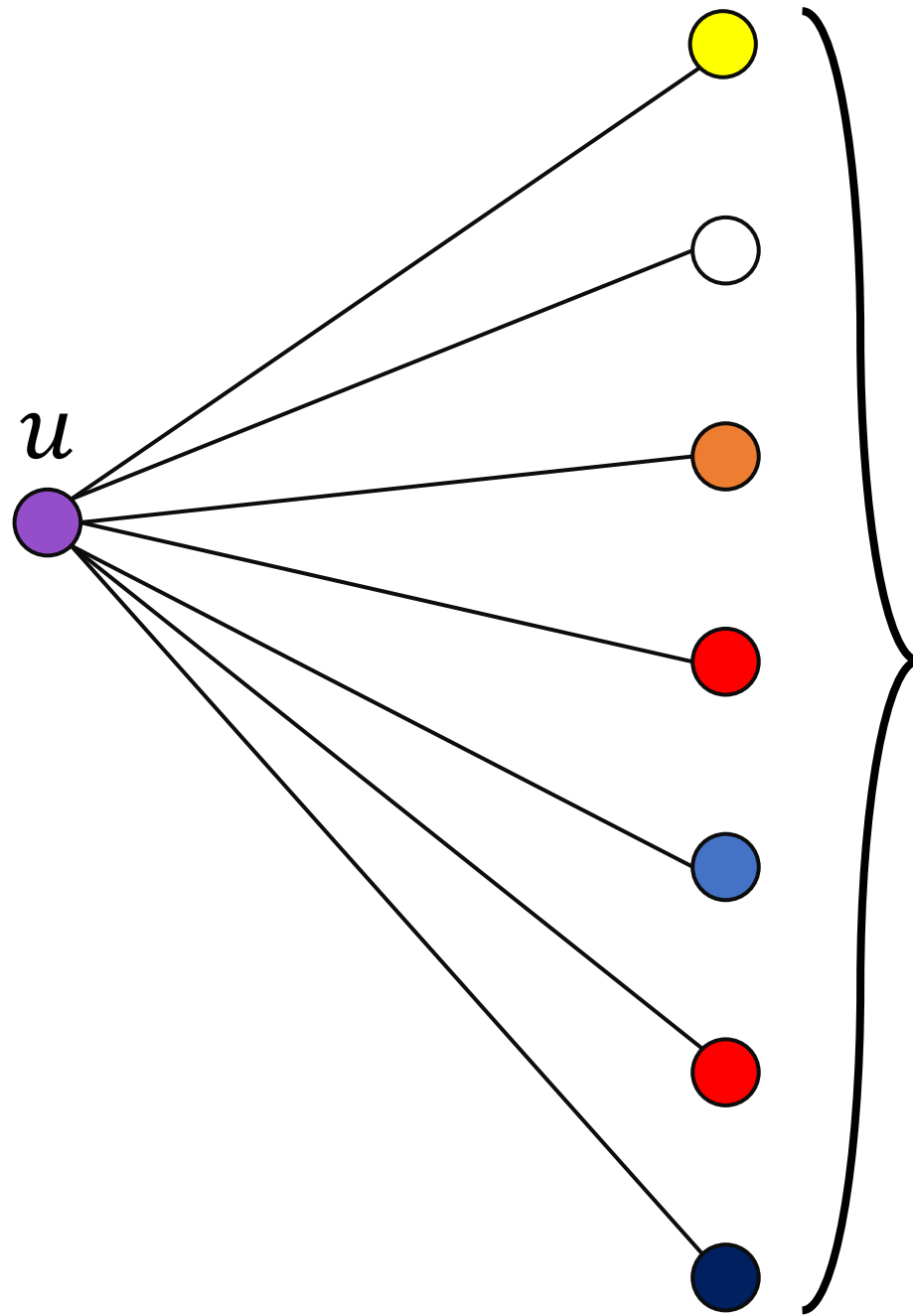
One out of  $\Delta + 1$   
is free.

## Algorithm:

Iterate over the  $q$  colors,  
from highest to lowest.

Always pick the smallest  
free color.

# 3-Coloring a Ring



At most  $\Delta$   
different colors.

One out of  $\Delta + 1$   
is free.

## Algorithm:

Iterate over the  $q$  colors,  
from highest to lowest.

Always pick the smallest  
free color.

## Analysis:

Since  $C$  is a coloring, no  
neighbors pick at the  
same time.

Runtime clearly  $O(q)$ .

# 3-Coloring a Ring

**Theorem:**

There is a distributed algorithm that finds a 3-coloring of a ring in time  $O(\log n)$

**Proof:**

The 4-coloring algorithm combined with color reduction.

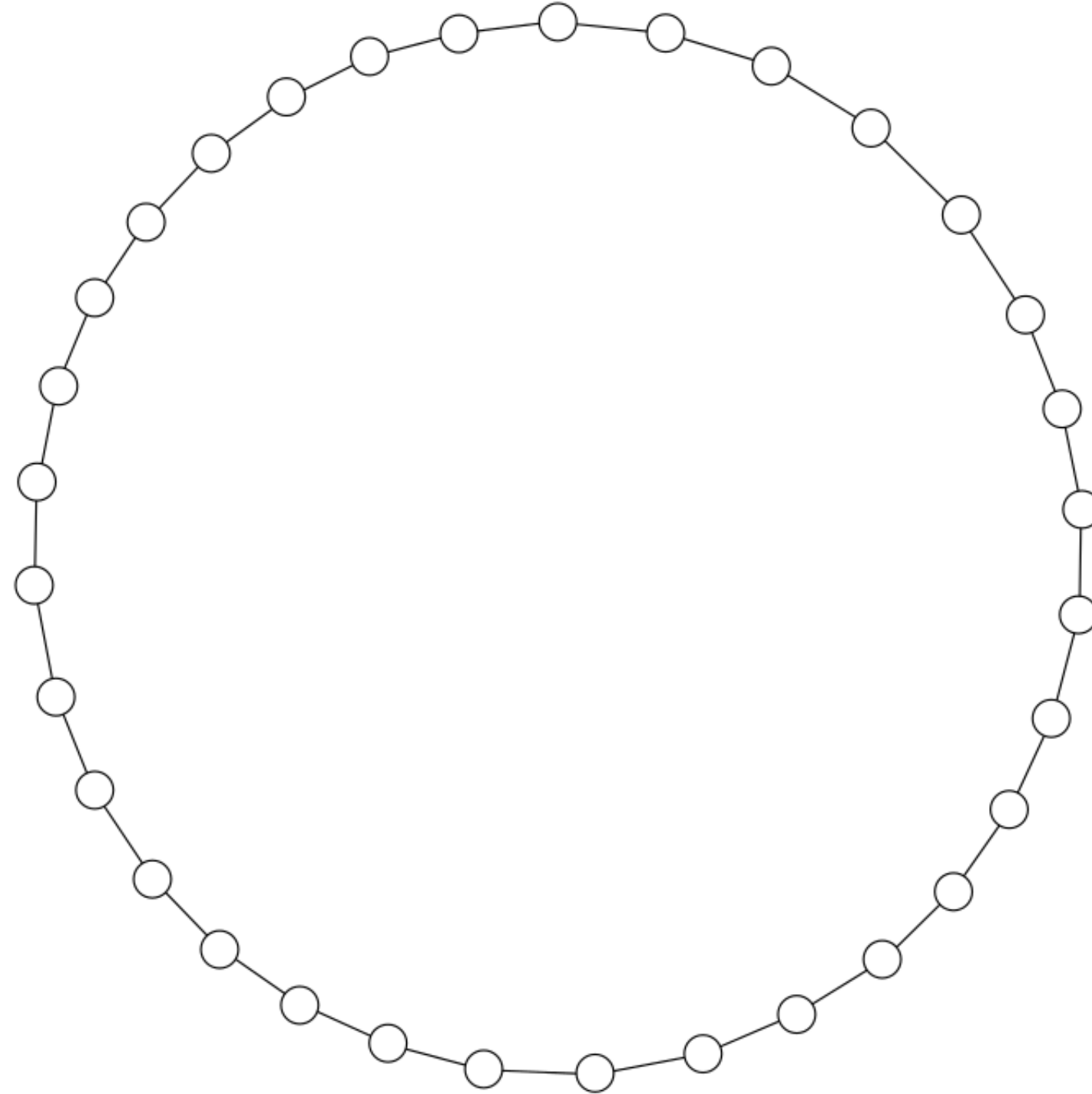


# Outline

- Intro
  - What this is not
- Coloring
  - $\Delta + 1$  colors
- The LOCAL model
- Coloring a ring
  - Color reduction
  - **Lower bound**

# 2-coloring

So, why not color  
with 2-colors?

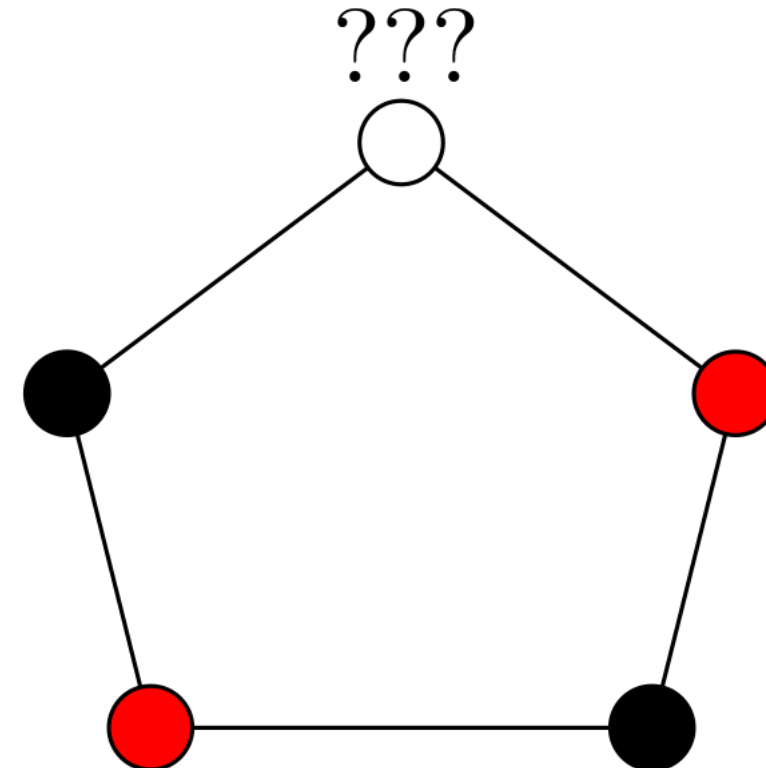


# 2-coloring

So, why not color  
with 2-colors?

**Answer 1:**

It might not be  
possible at all.



# 2-coloring

So, why not color  
even paths with  
2-colors?

# 2-coloring

So, why not color  
even paths with  
2-colors?

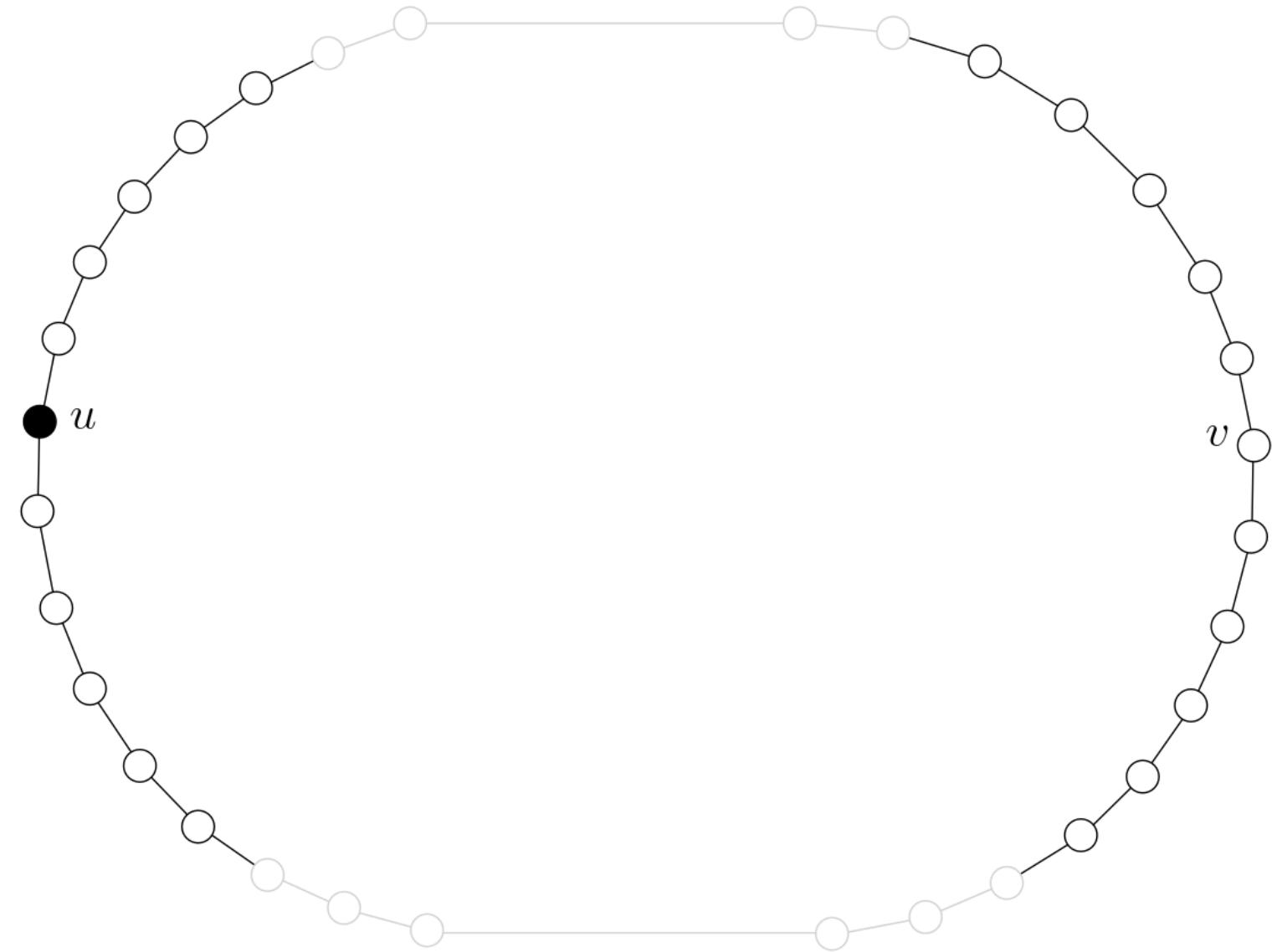
Suppose we have  
an algorithm that  
runs in time  $\left(\frac{n}{4}\right)$



# 2-coloring

So, why not color even paths with 2-colors?

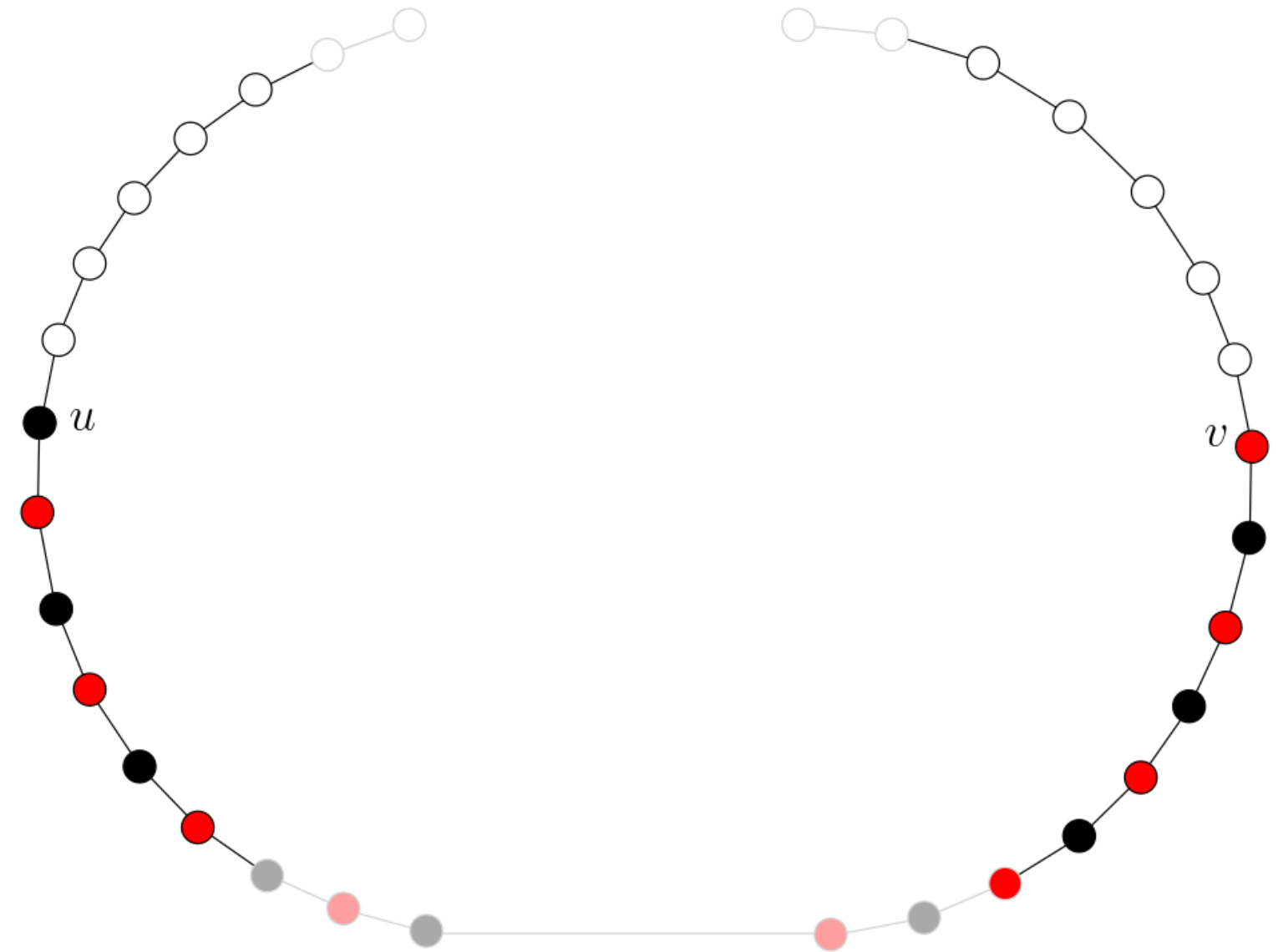
Suppose we have an algorithm that runs in time  $\left(\frac{n}{4}\right)$



# 2-coloring

Color choice of  $u$   
determines the  
choice of  $v$ .

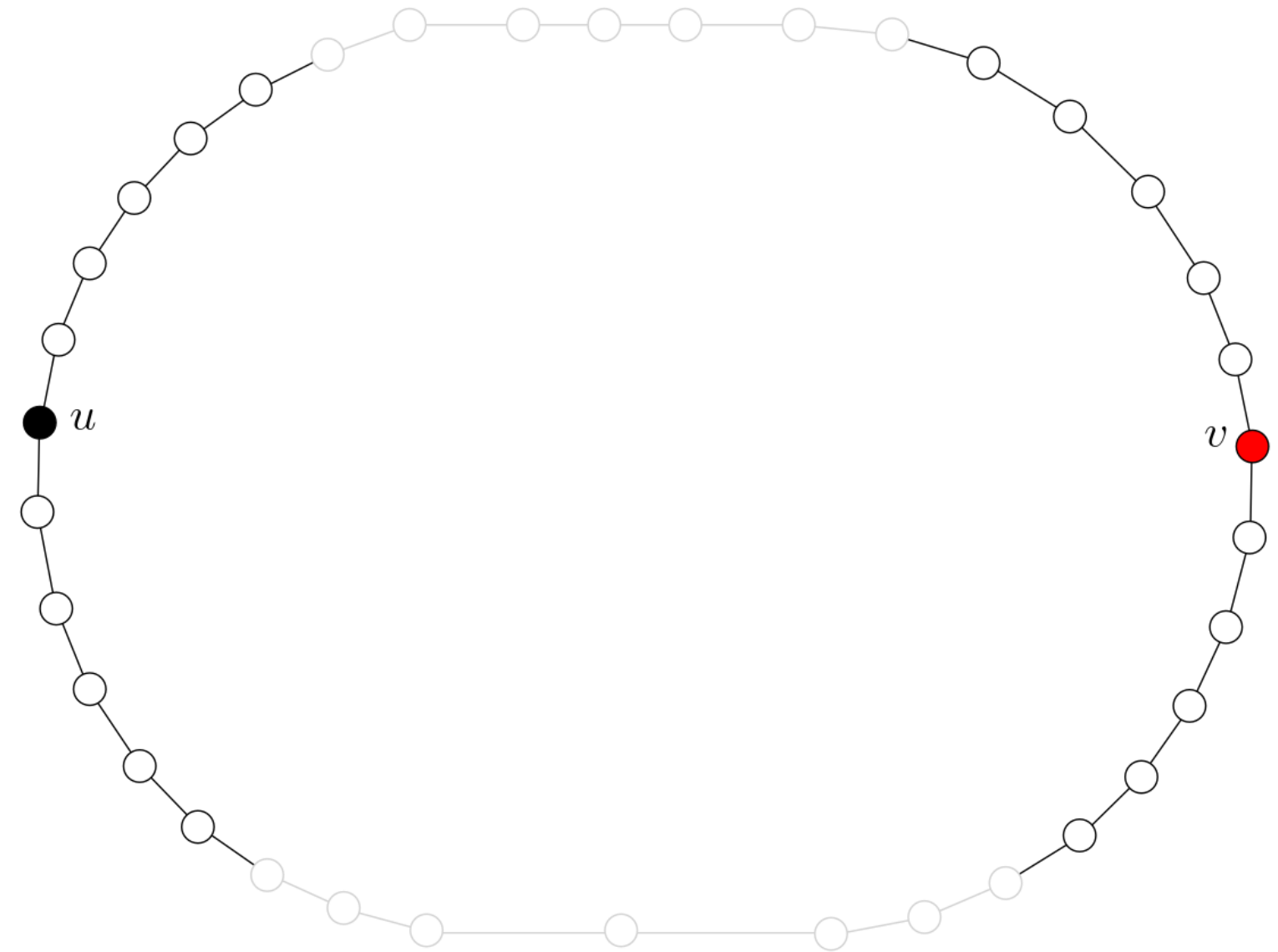
Suppose we have  
an algorithm that  
runs in time  $\left(\frac{n}{4}\right)$ .



# 2-coloring

Let's change the parity of their distance. The output of  $v$  cannot depend on this change.

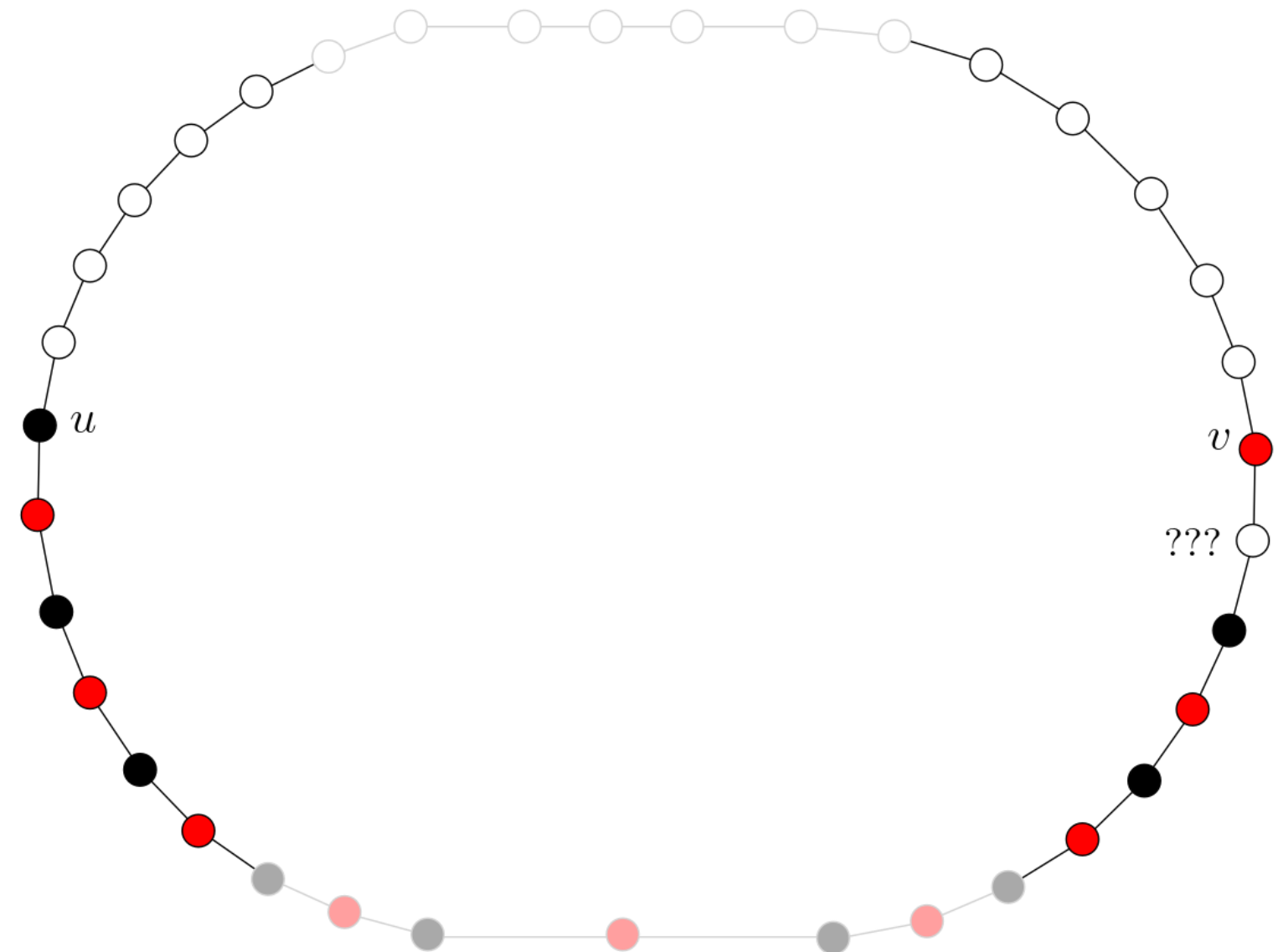
Suppose we have an algorithm that runs in time  $\left(\frac{n}{4}\right)$ .



# 2-coloring

Let's change the parity of their distance. The output of  $v$  cannot depend on this change.

Suppose we have an algorithm that runs in time  $\left(\frac{n}{4}\right)$ .



Contradiction. Any algorithm takes  $\Omega(n)$  time.

# 2-Coloring

**Theorem:**

The complexity of distributed 2-coloring an even ring is  $\Theta(n)$ .



# Literature

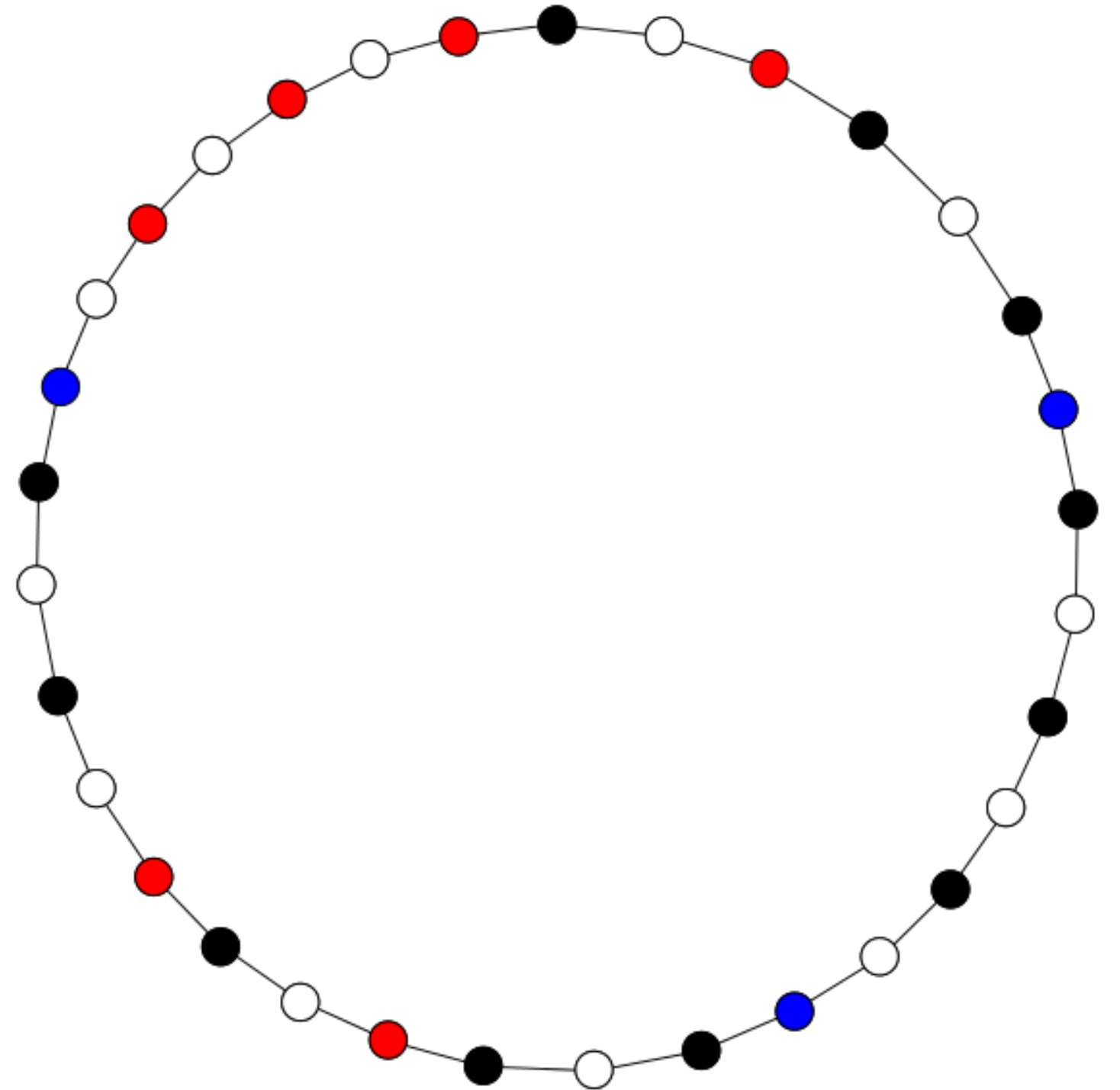
**3 Coloring a ring**

**Runtime:**

$$\Theta(\log^* n)$$

[Cole-Vishkin Inf. Contr.'86]

[Linial FOCS '87]



# Color Reduction

$(\Delta + 1)$ -coloring **in general graphs:**

$$\log^2 \Delta \cdot \log(n)$$

[Ghaffari, Kuhn Nov 2020]

$$\sqrt{\Delta \log \Delta} + \log^* n$$

[Maus, Tonoyan 2020]

# Color Reduction

$(\Delta + 1)$ -coloring **in general graphs:**

$$\log^2 \Delta \cdot \log(n)$$

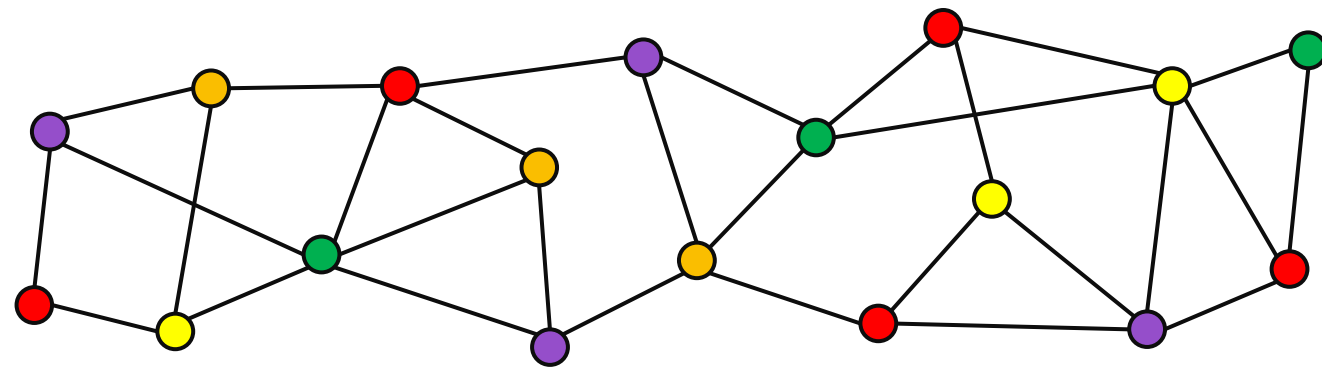
[Ghaffari, Kuhn Nov 2020]

$$\sqrt{\Delta \log \Delta} + \log^* n$$

[Maus, Tonoyan 2020]

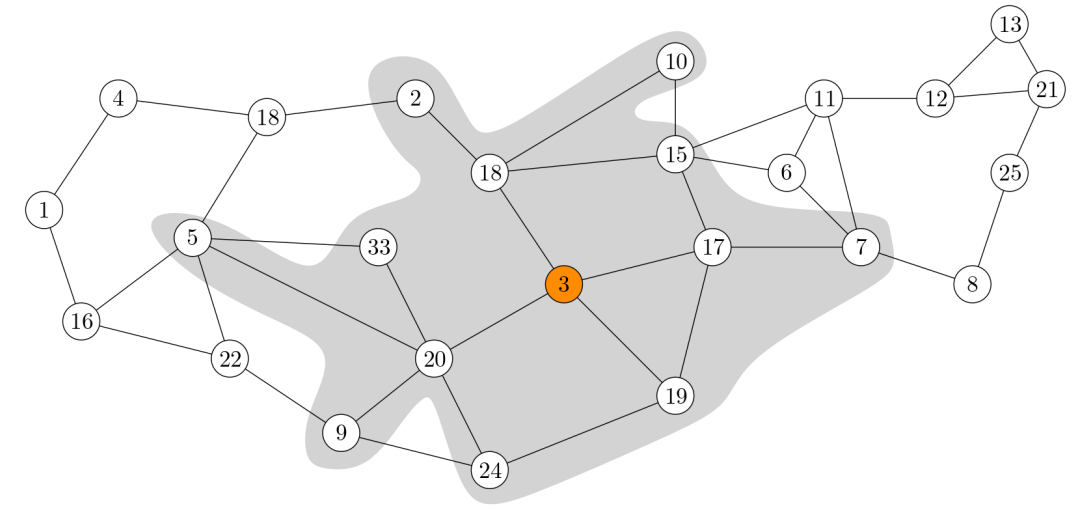
Huge difference for  
small values of  $\Delta$ .

# Wrap-up



$(\Delta + 1)$ -coloring

**Coloring a ring:**  
3 colors:  $\Theta(\log n)$   
2 colors:  $\Theta(n)$



**The LOCAL model:**  
How far do we need to communicate?