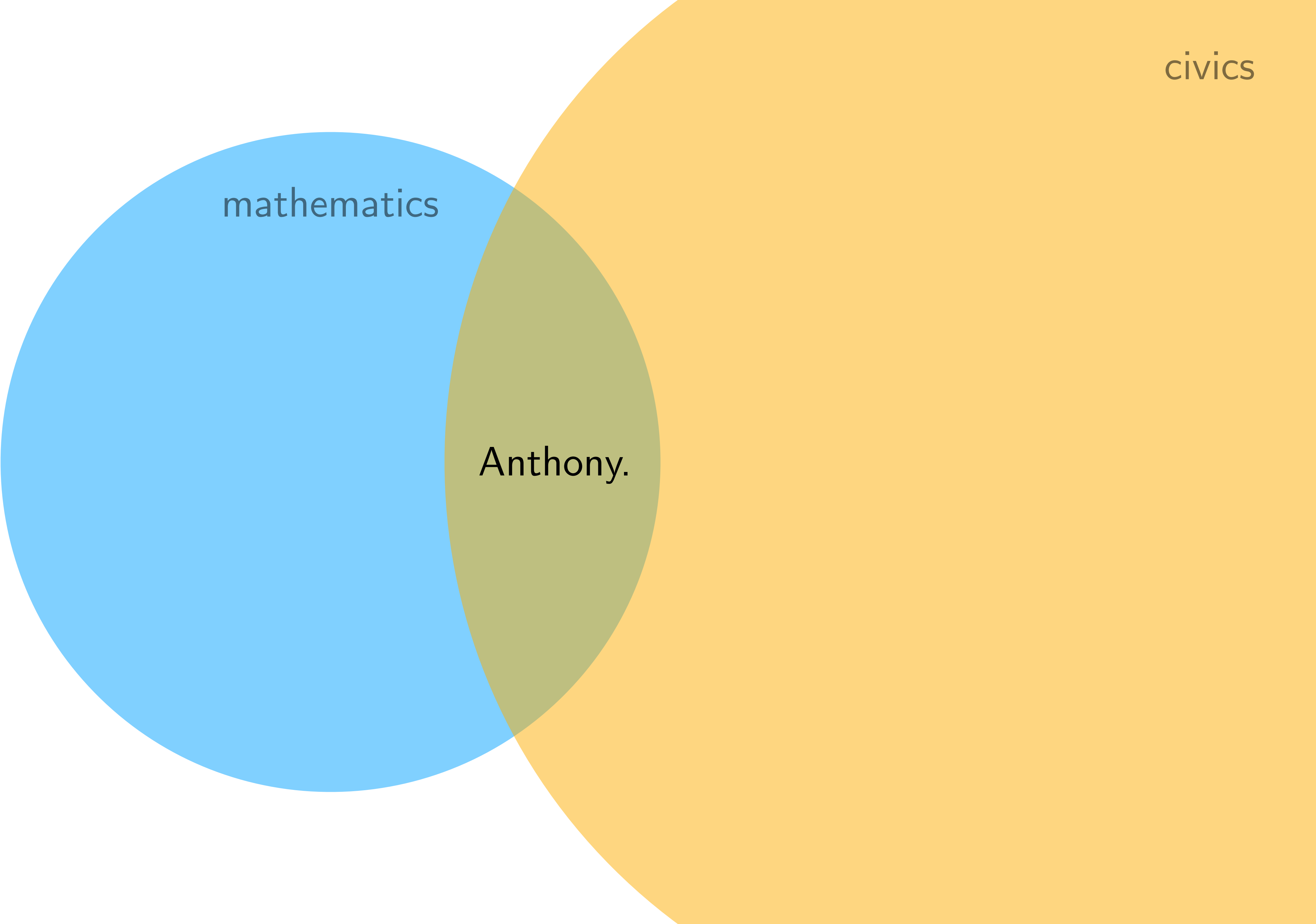


# mathematics and redistricting

what we know, what we don't, and where we're going

hi! I'm Anthony.



mathematics

civics

Anthony.

the end!

**what's in this talk**

# **what's in this talk**

1. a redistricting primer

## **what's in this talk**

1. a redistricting primer
2. some mathematical history

## **what's in this talk**

1. a redistricting primer
2. some mathematical history
3. contemporary research



## **what's in this talk**

1. a redistricting primer
2. some mathematical history
3. contemporary research
4. things that are hard

## what's in this talk

1. a redistricting primer
2. some mathematical history
3. contemporary research
4. things that are hard
5. where we're *hopefully* going

**redistricting**

## **redistricting**

the practice of dividing a jurisdiction into electoral districts.

**gerrymandering**

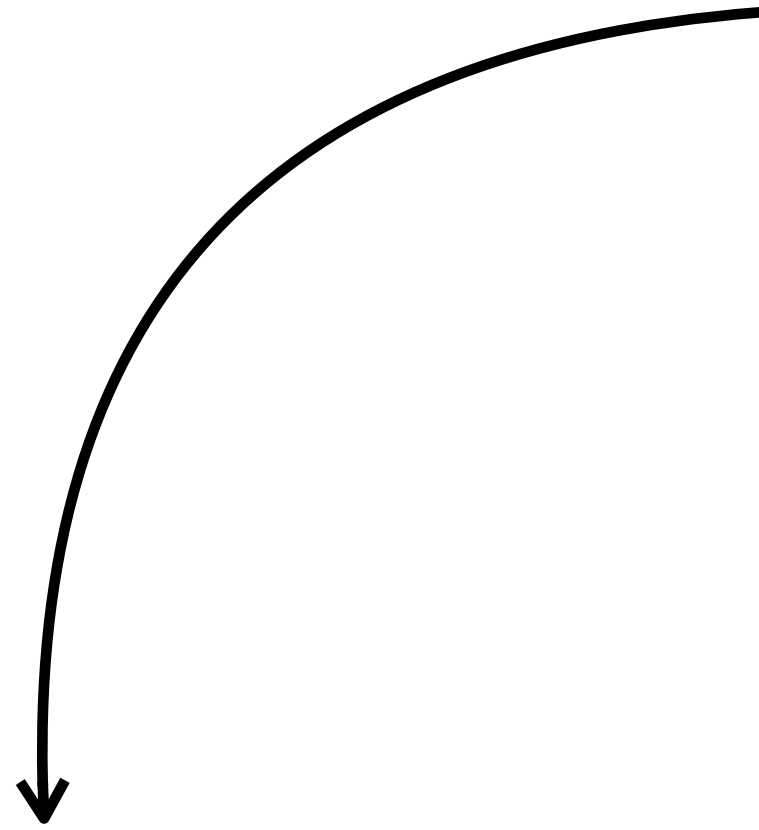
## **gerrymandering**

the practice of redistricting to favor *or disfavor* a specific group

# 1 The United States Census

everyone\* gets counted.

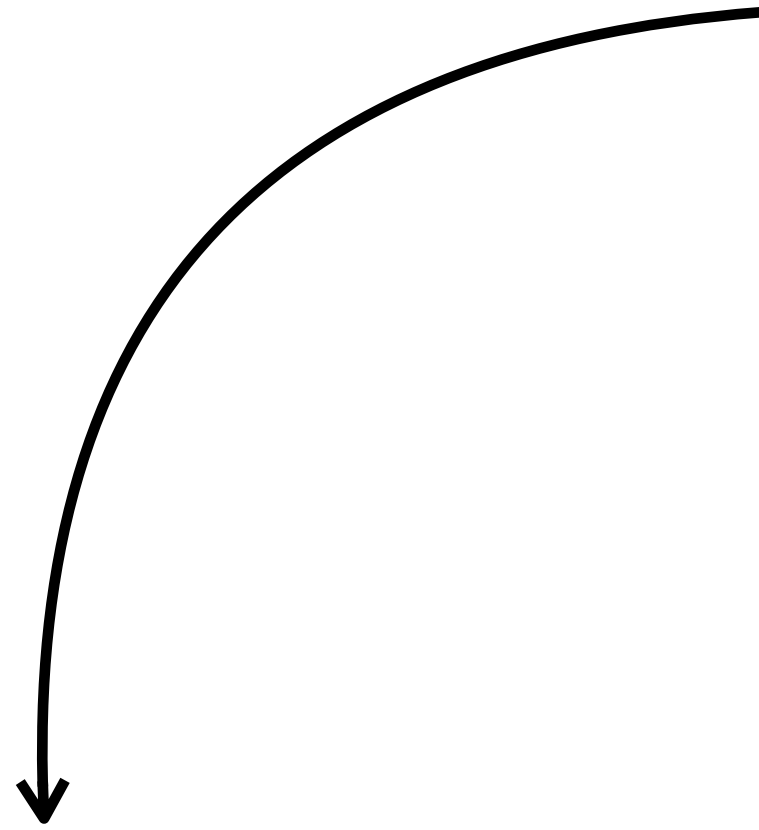
**1** The United States Census  
everyone\* gets counted.



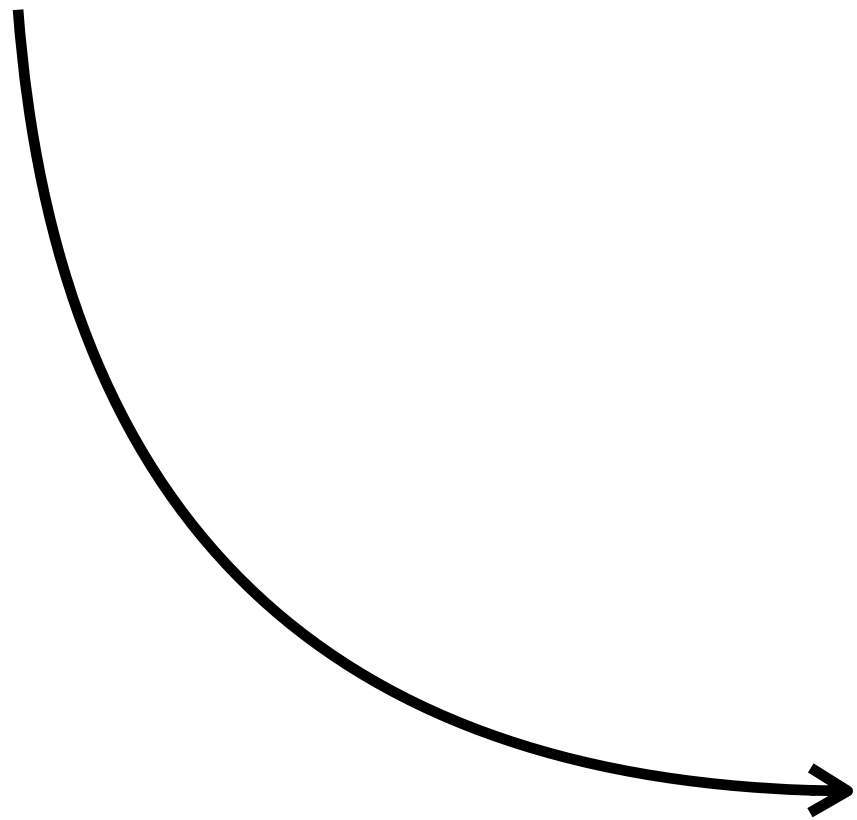
**2** Redistricting statutes  
the rules of the game.



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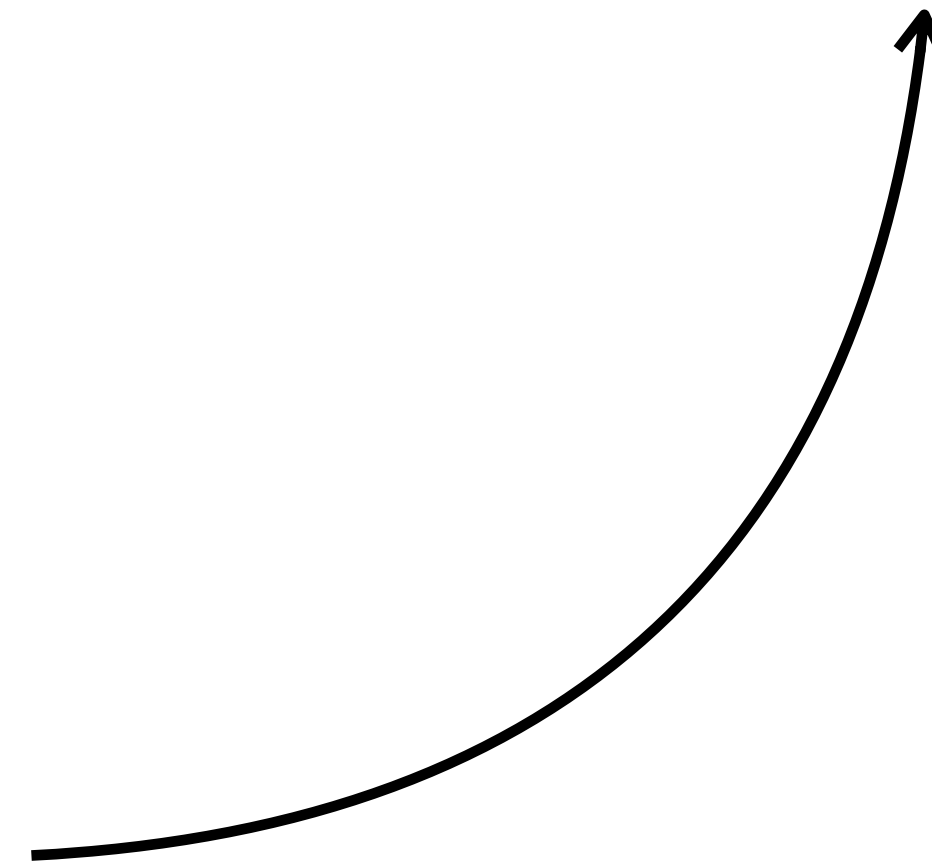
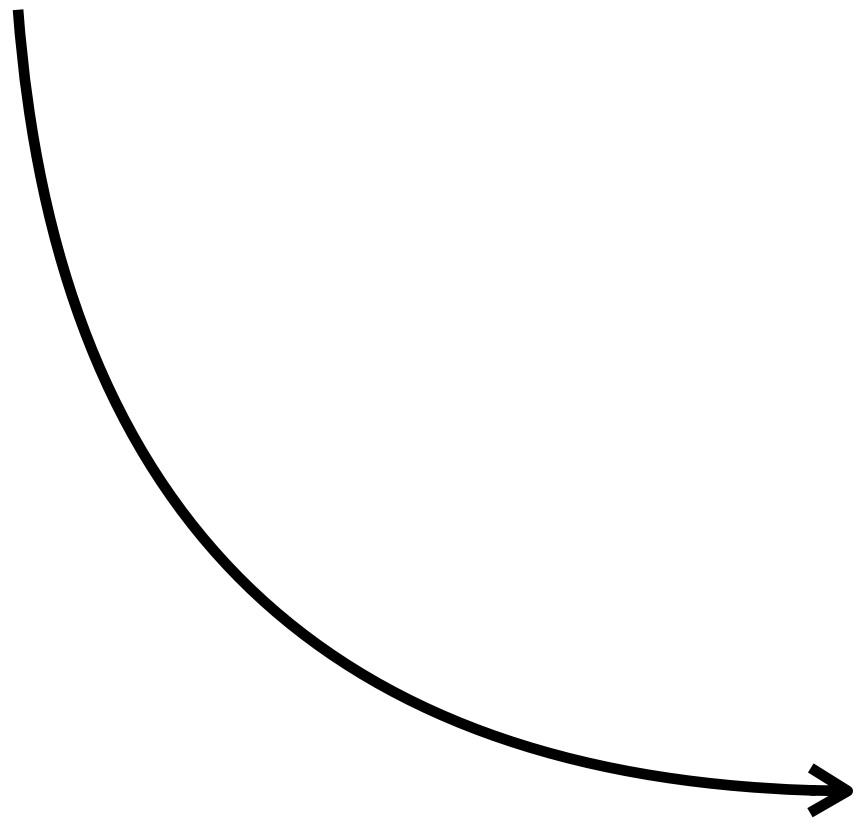
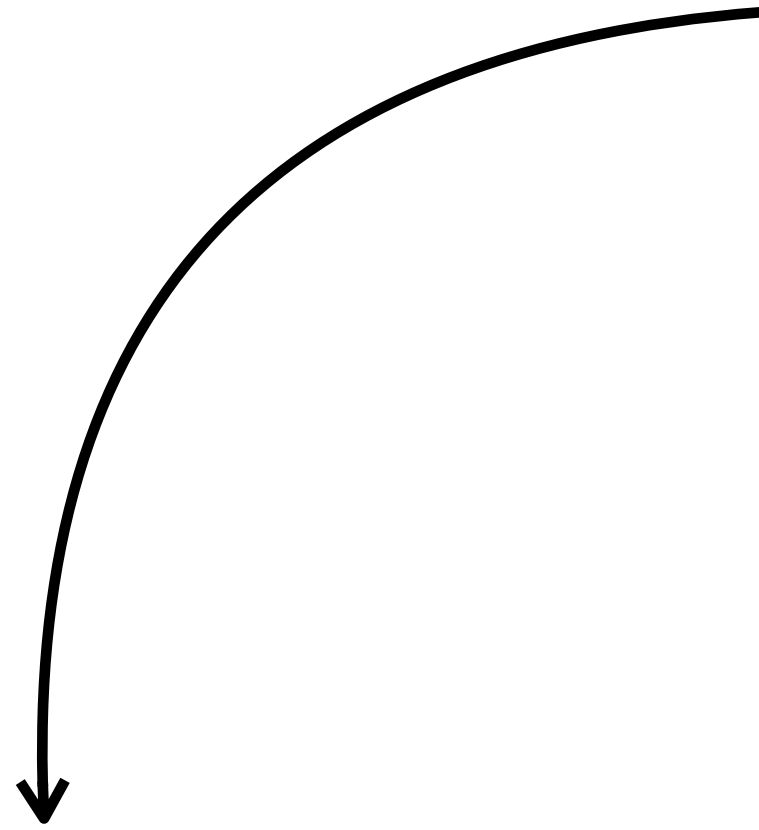
**3** Drawing the maps  
where the sausage gets made?

**1** The United States Census  
everyone\* gets counted.

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the rules of the game.

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where the sausage gets made?

**4** Challenging the maps  
someone's angry...

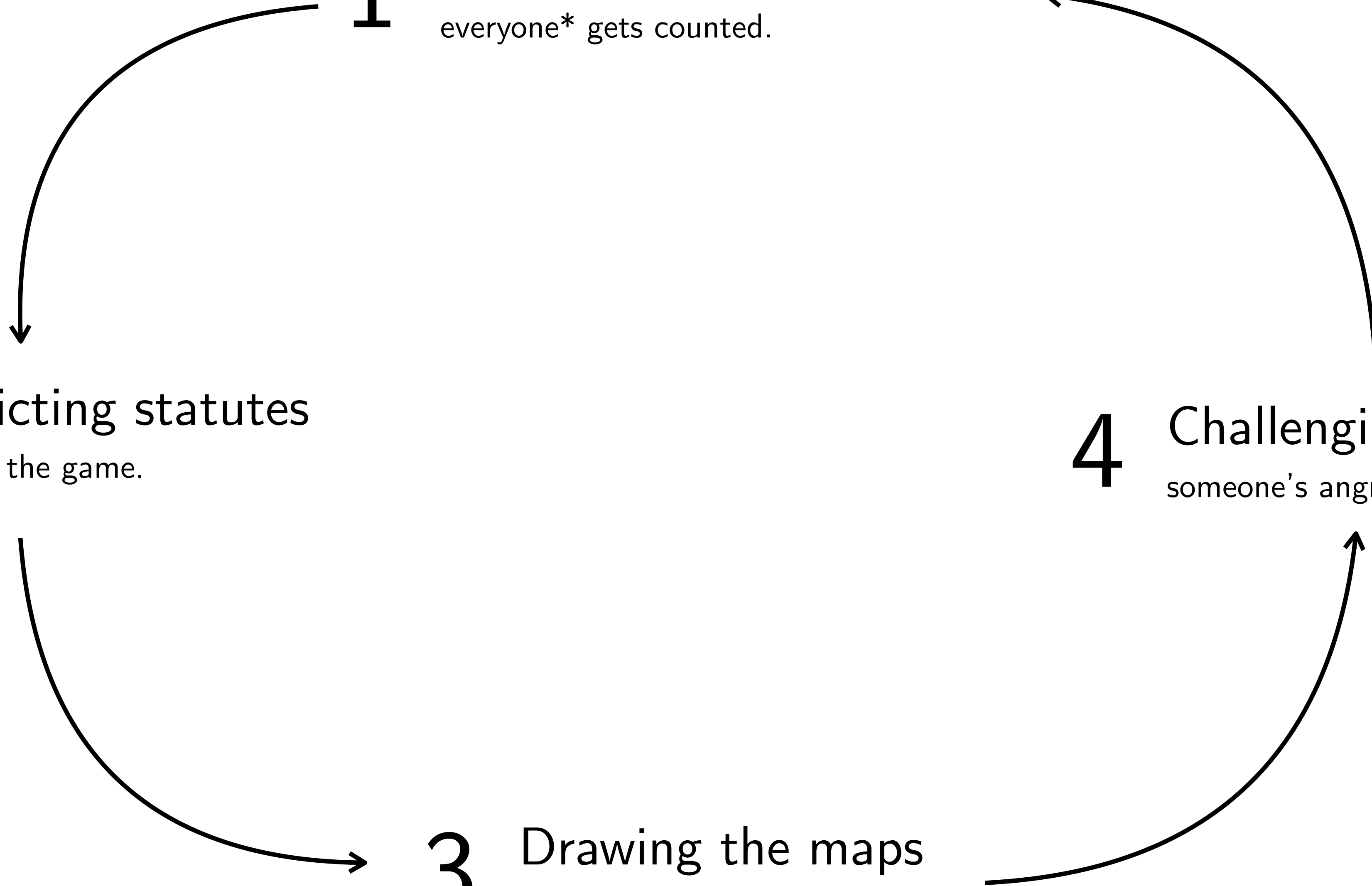


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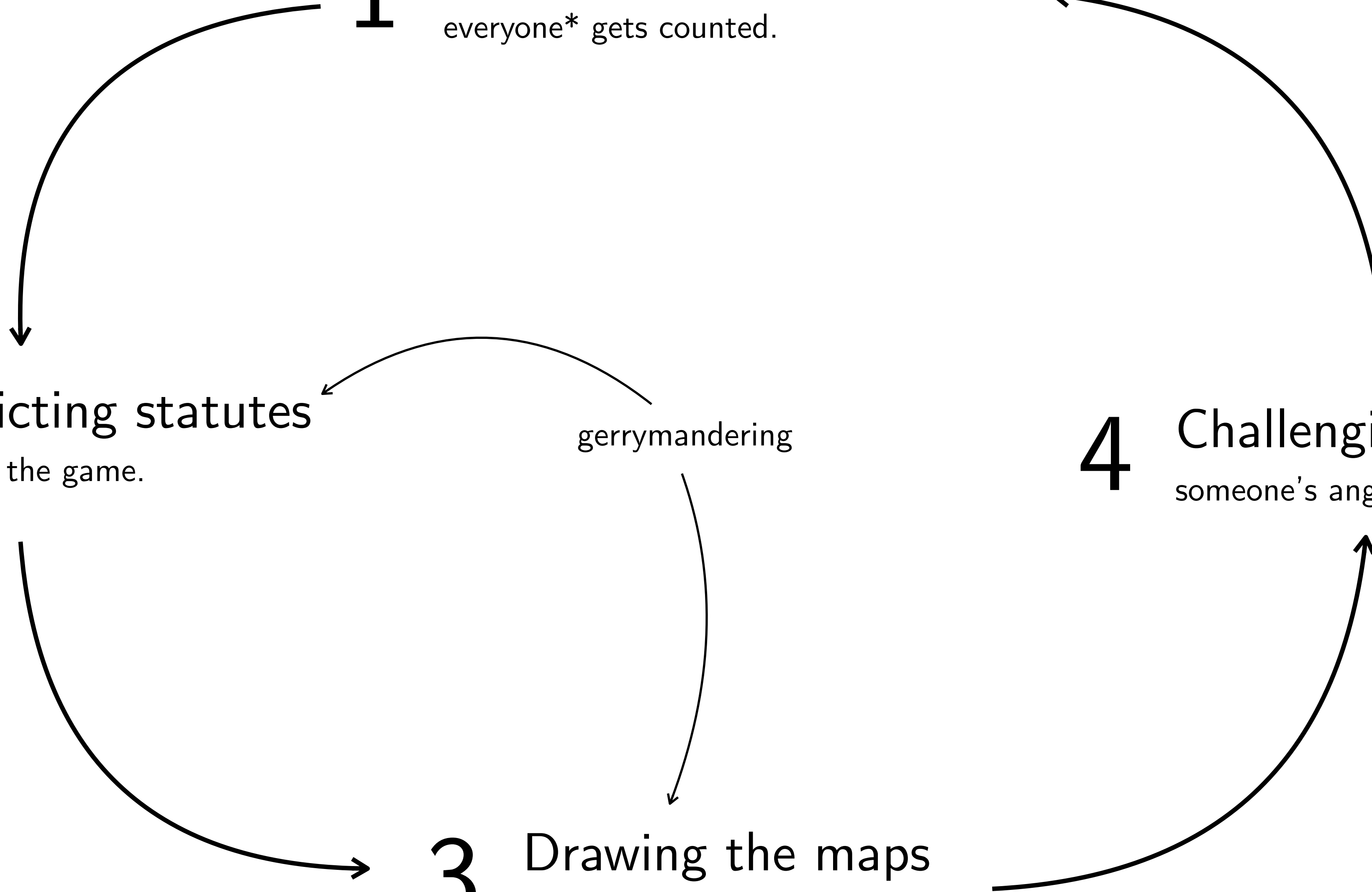


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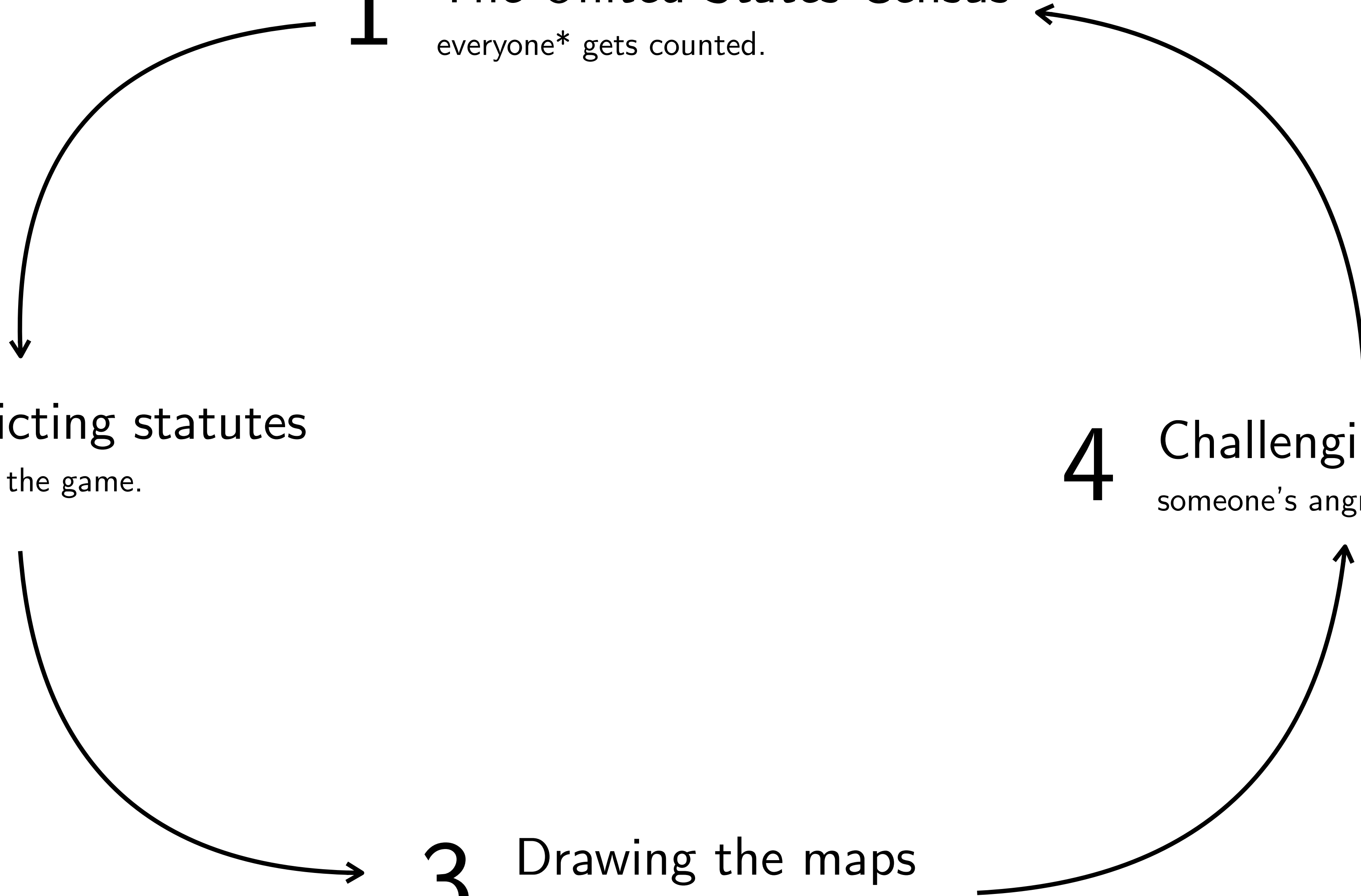


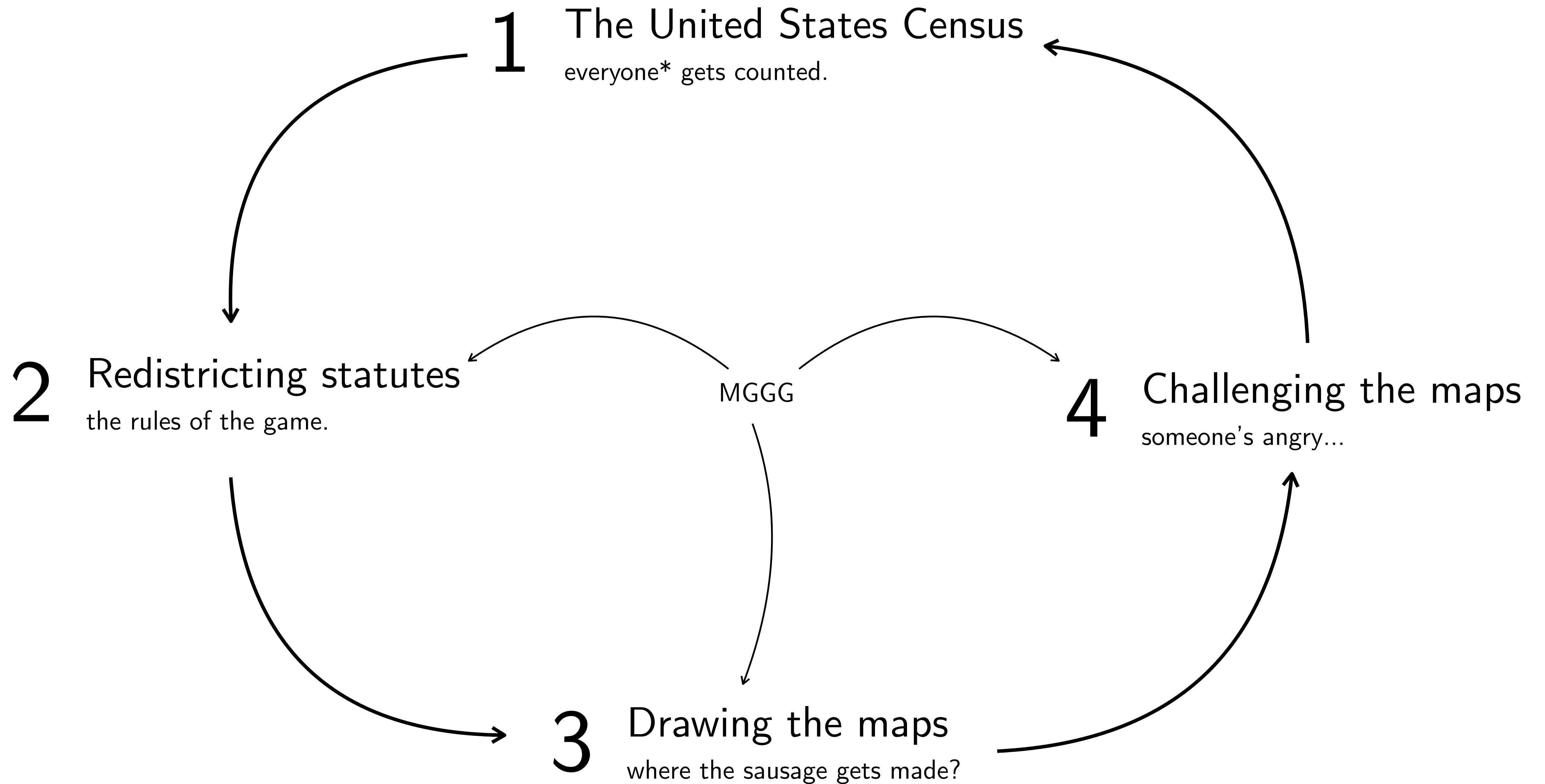
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## 2. some mathematical history

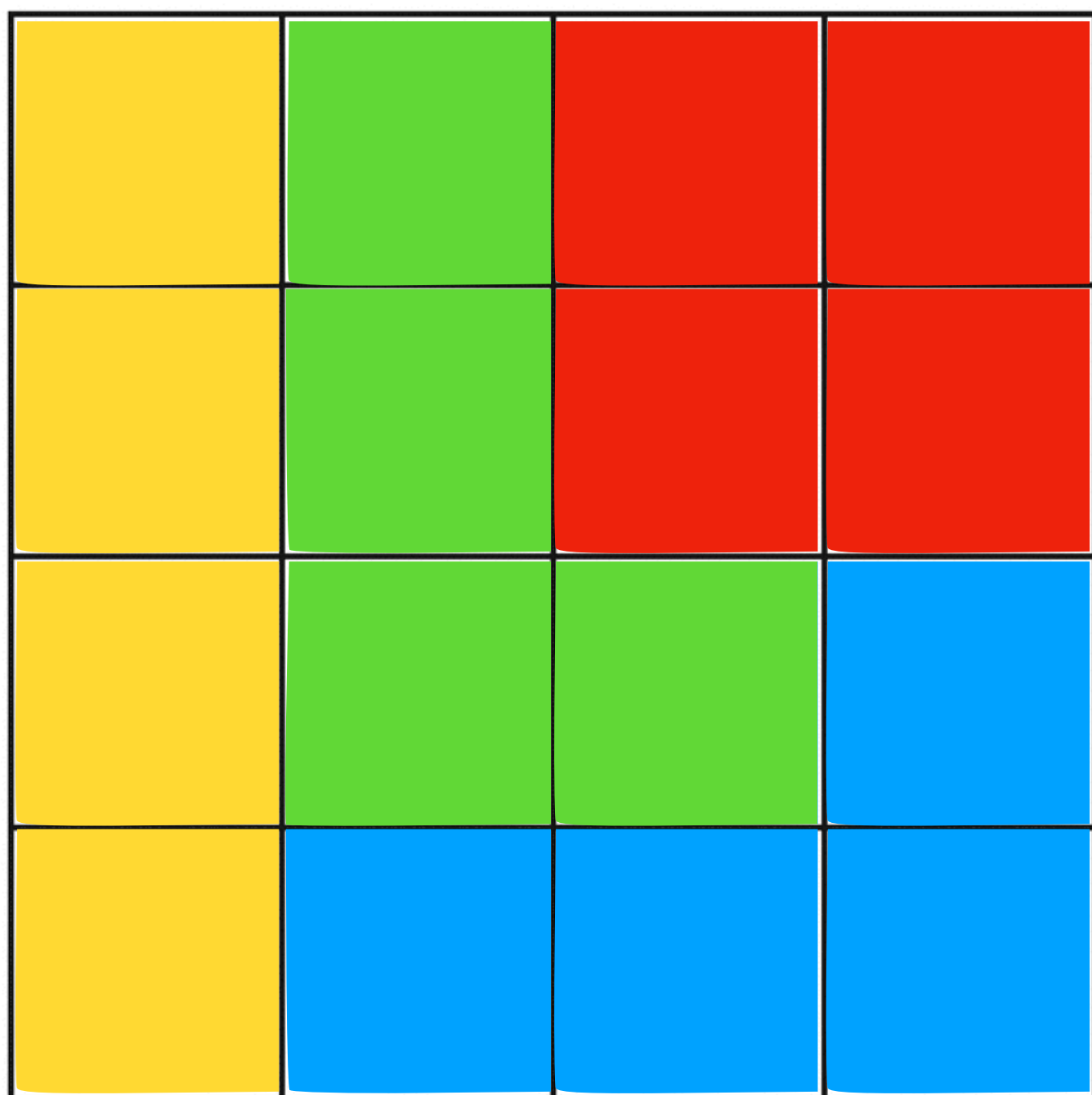
GerryChain

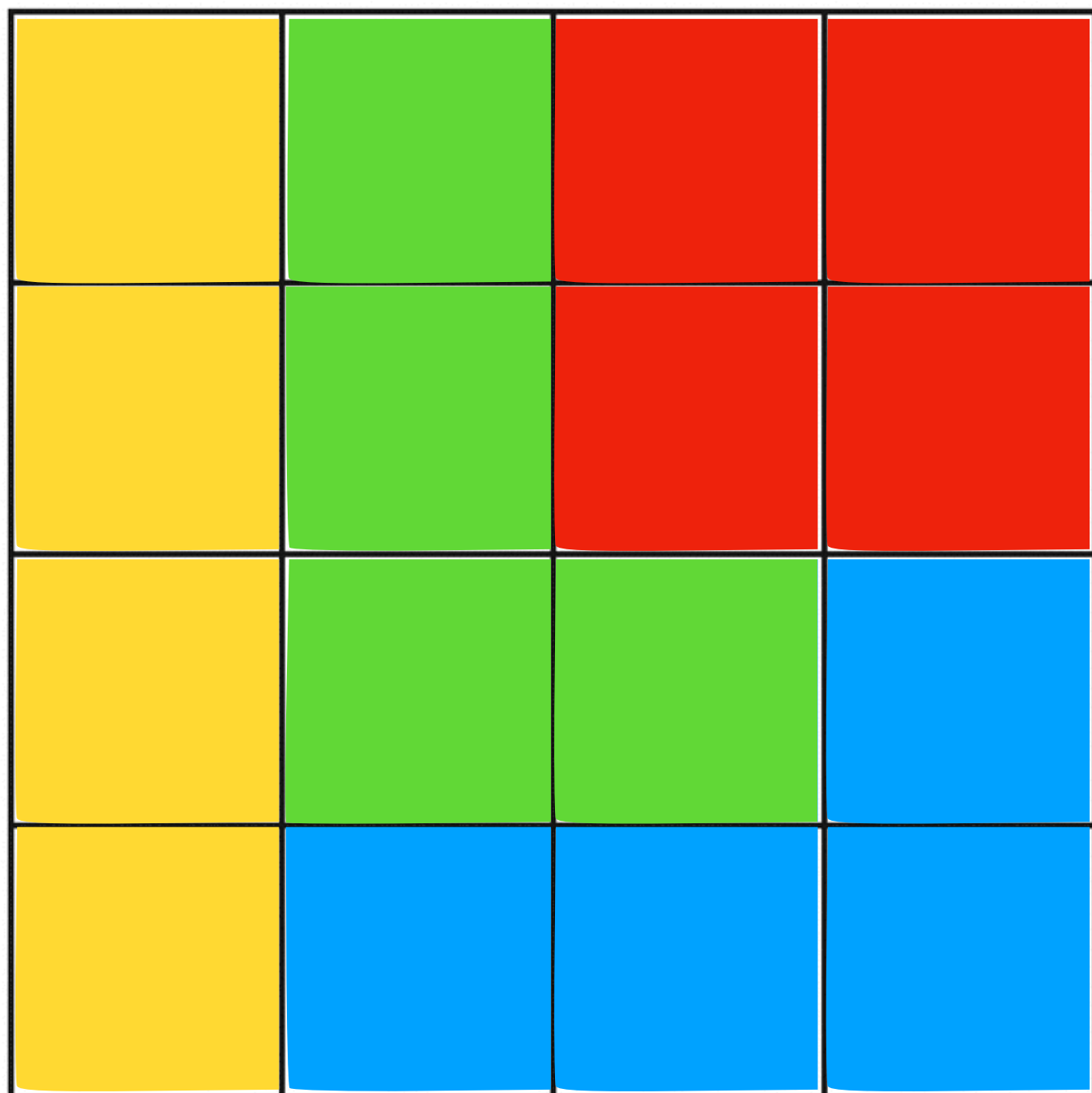




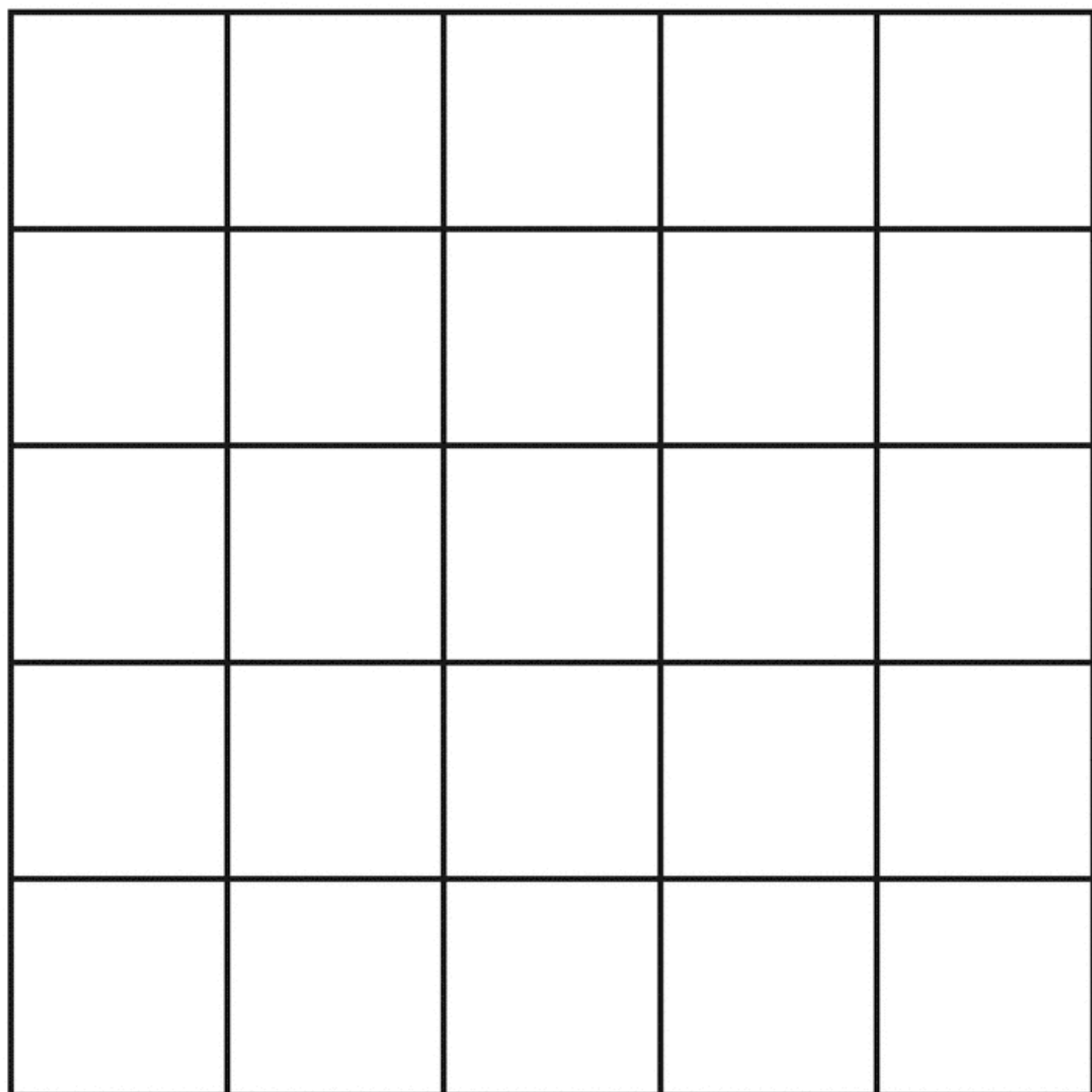


GerryChain



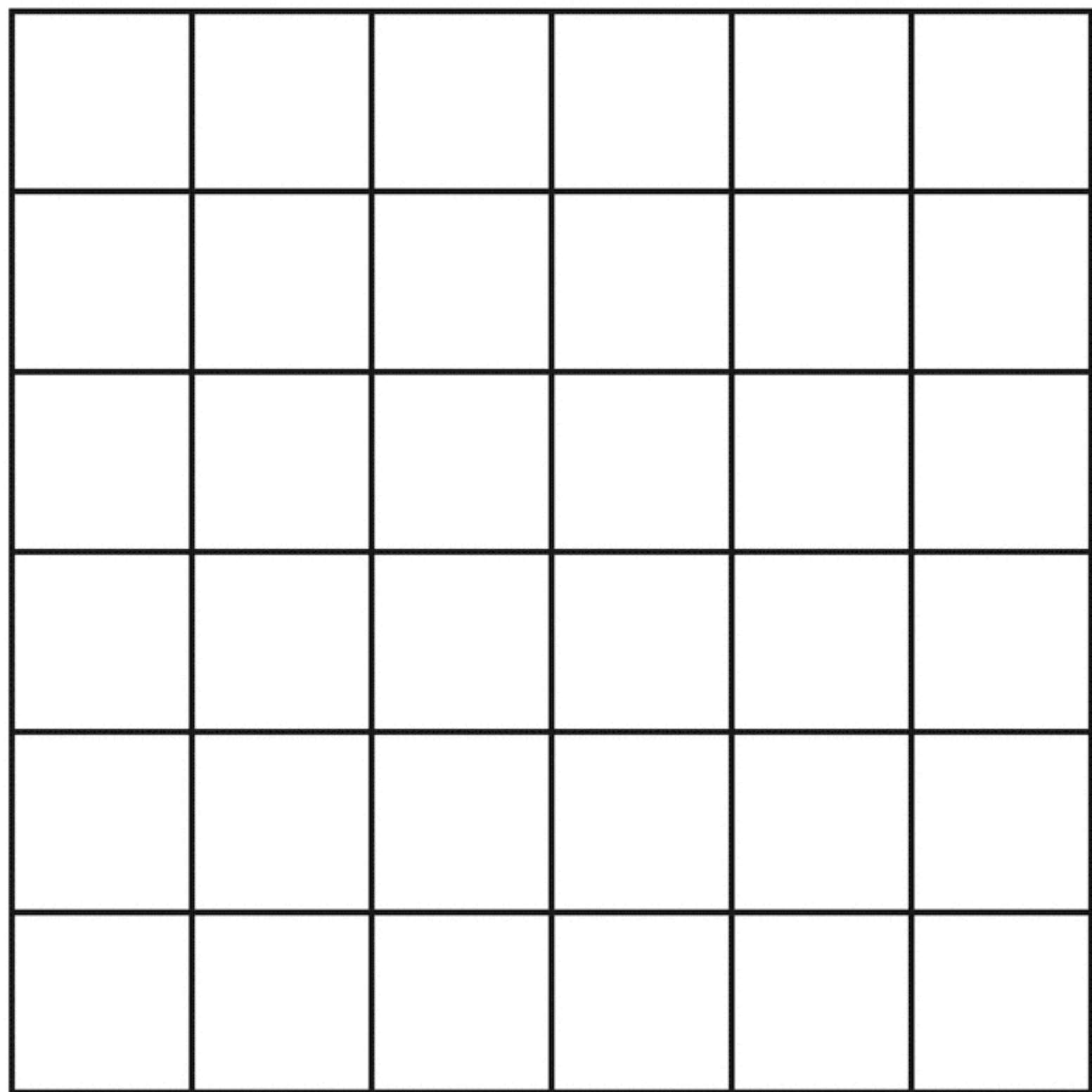
117

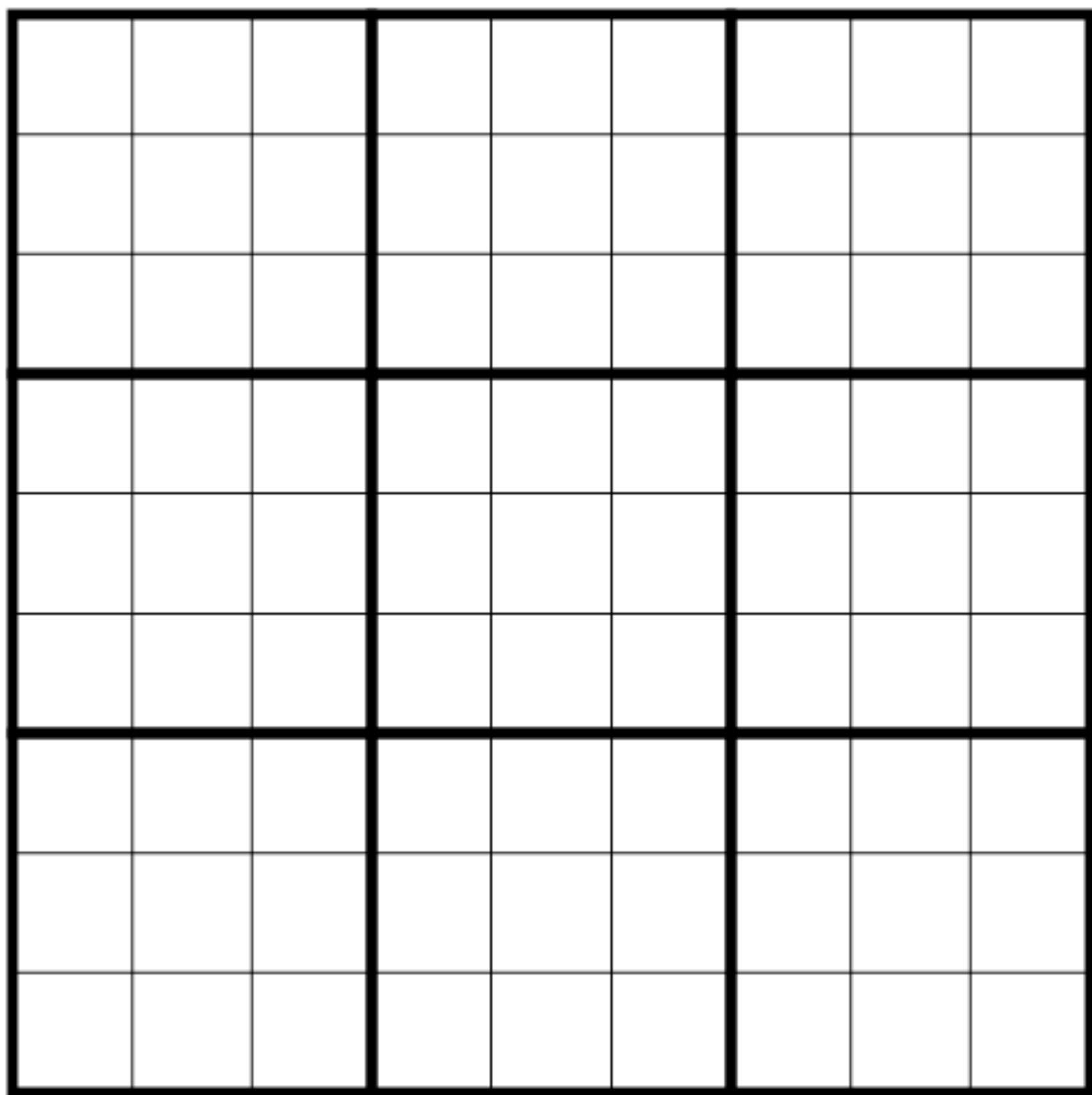
4,006

[illegible]



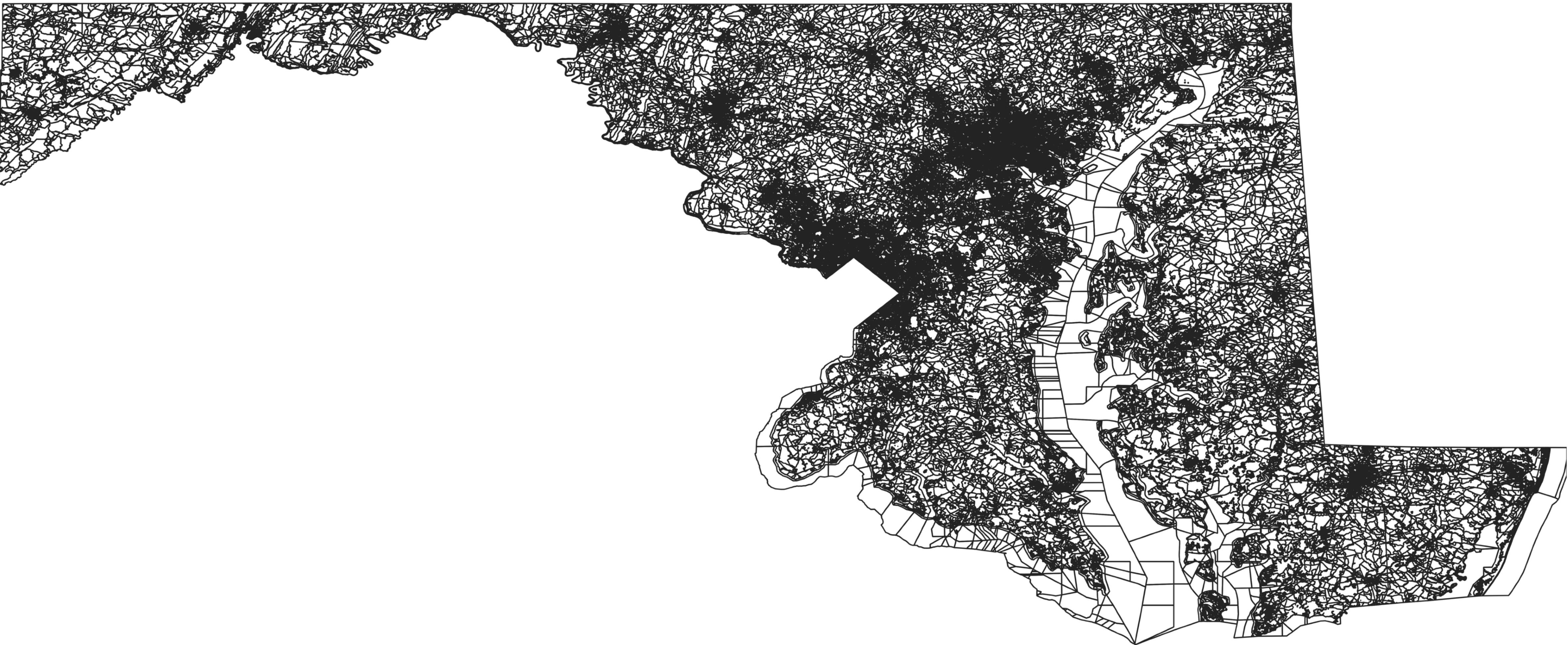


451,206

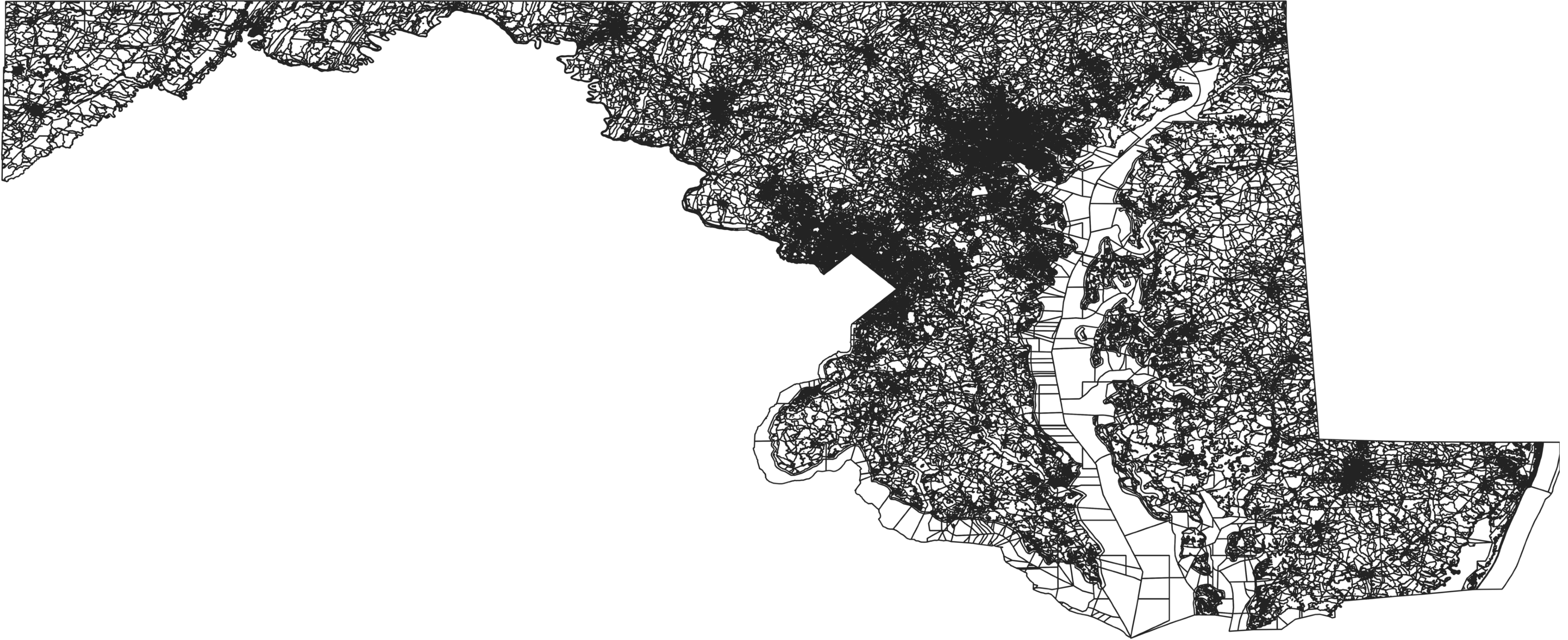





706,152,947,468,301







there are 145,247 individual in the state of Maryland.

Monte Carlo Markov chain

MCMC





a. large

- a. large
- b. contains districting plans that are “valid”

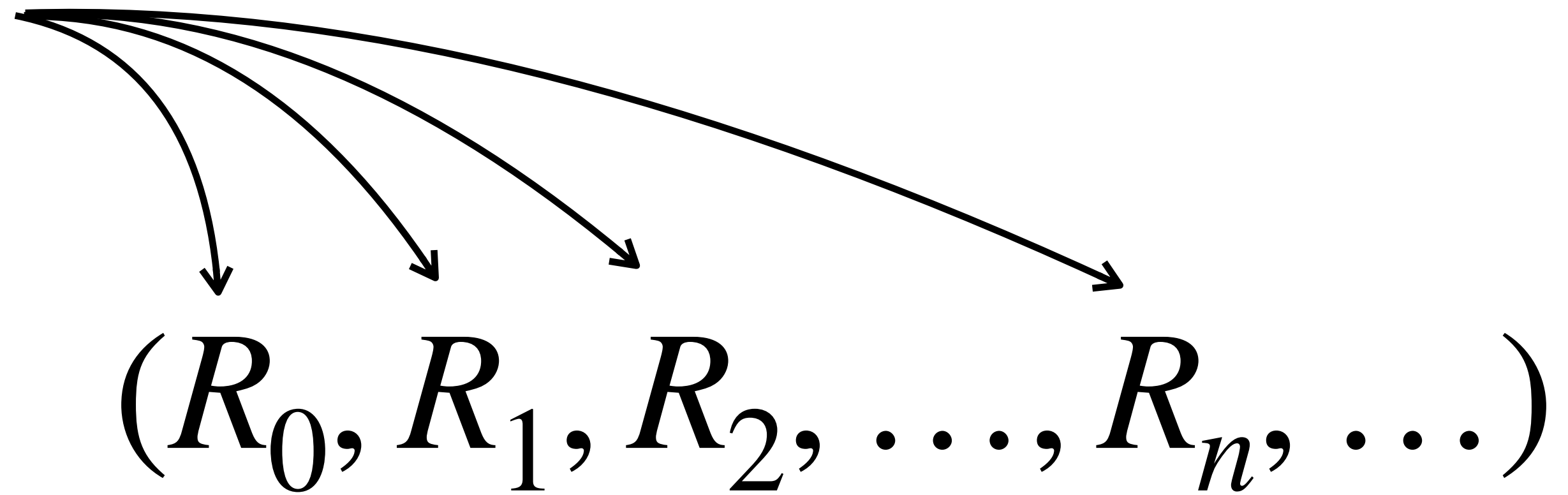
**Markov chain**

## Markov chain

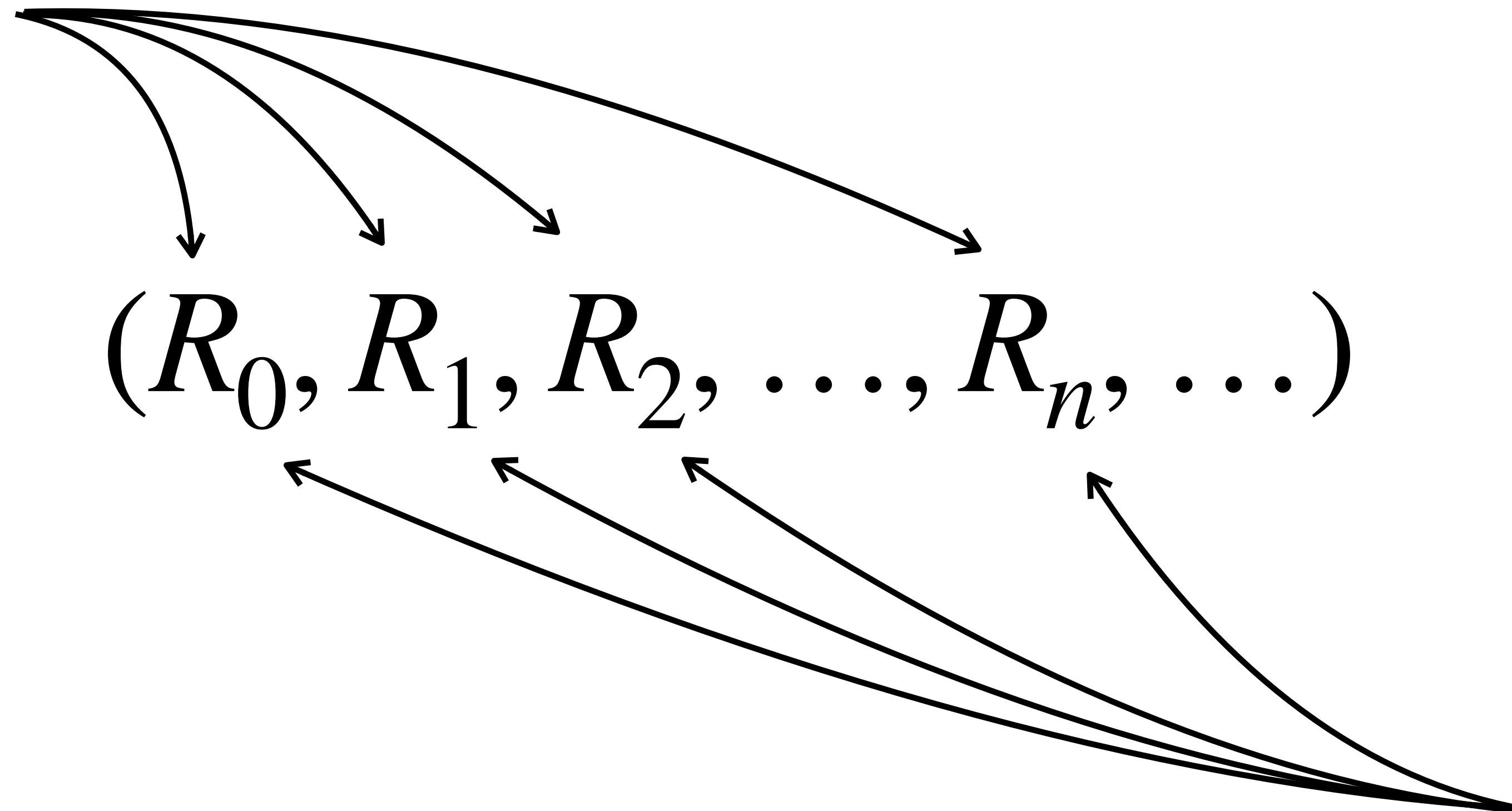
a *random process* equipped with the *memoryless property*.

$$(R_0, R_1, R_2, \dots, R_n, \dots)$$

draws from a random variable...



draws from a random variable...



indexed by some set

$$R_k = i_k$$



$$R_k = i_k \longrightarrow R_{k+1} = i_{k+1}$$

$$R_k = i_k \longrightarrow R_{k+1} = i_{k+1}$$

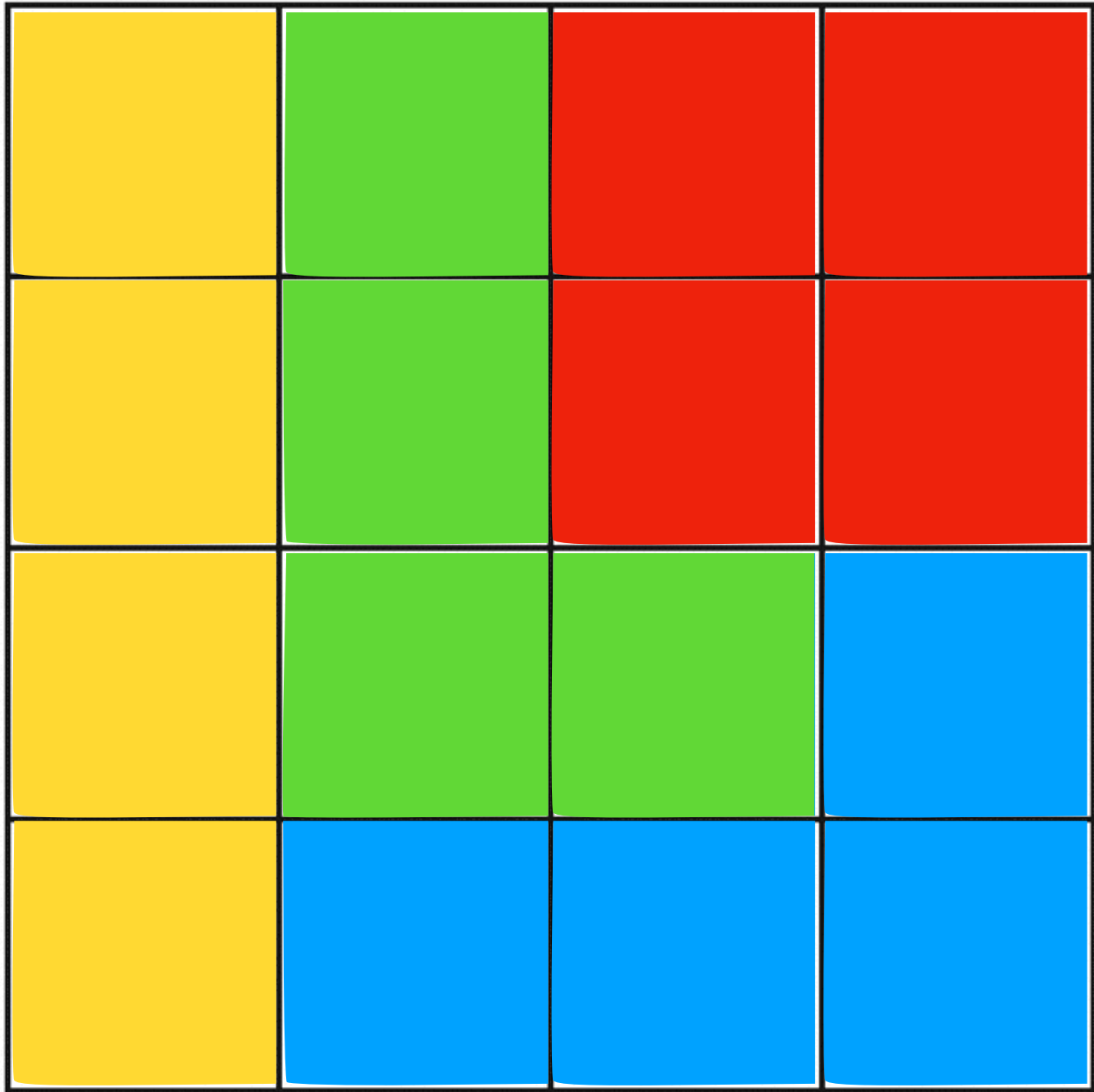
$$\mathbf{P} \left( R_{k+1} = i_{k+1} \mid R_k = i_k, R_{k-1} = i_{k-1}, \dots \right)$$

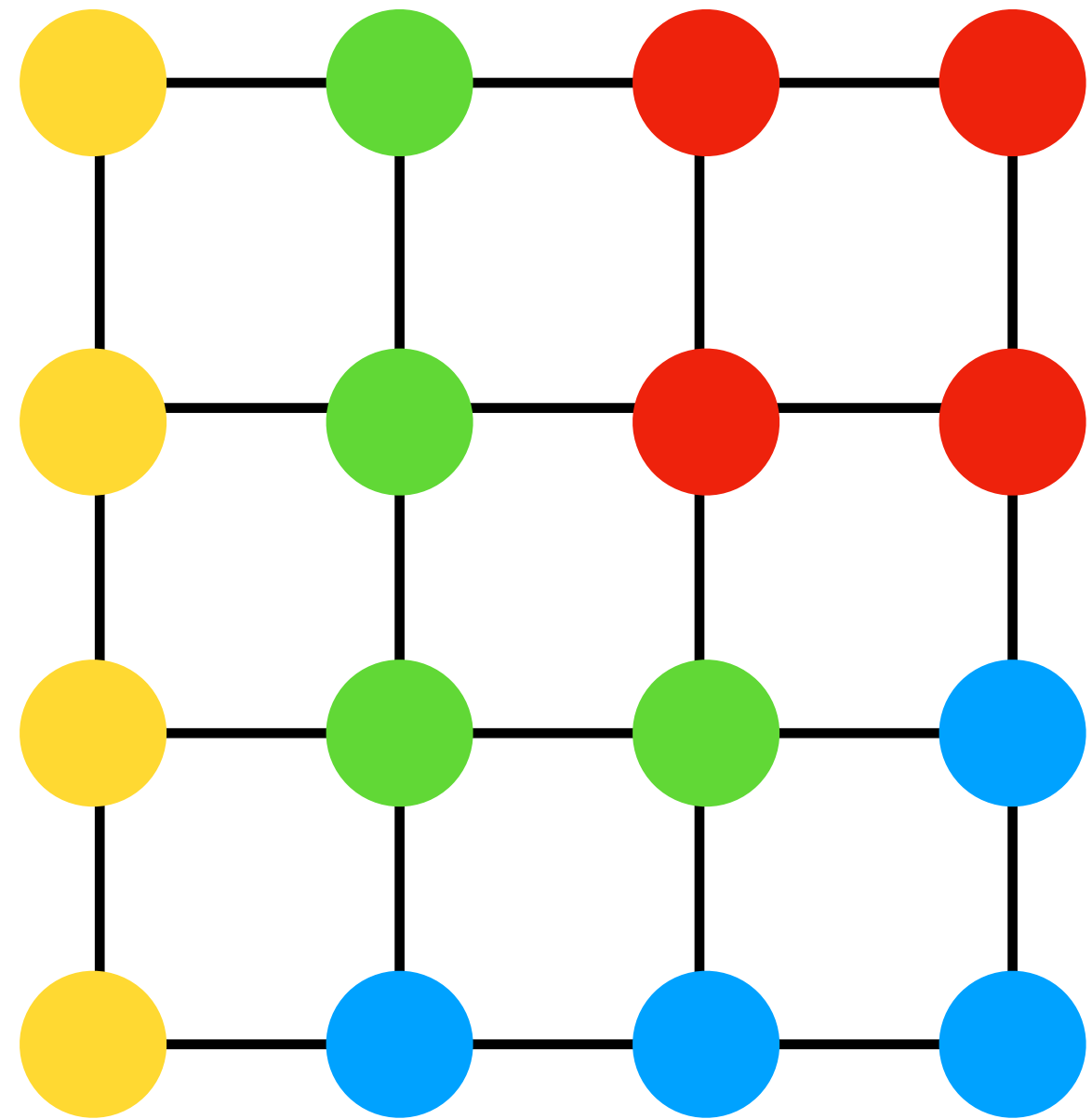
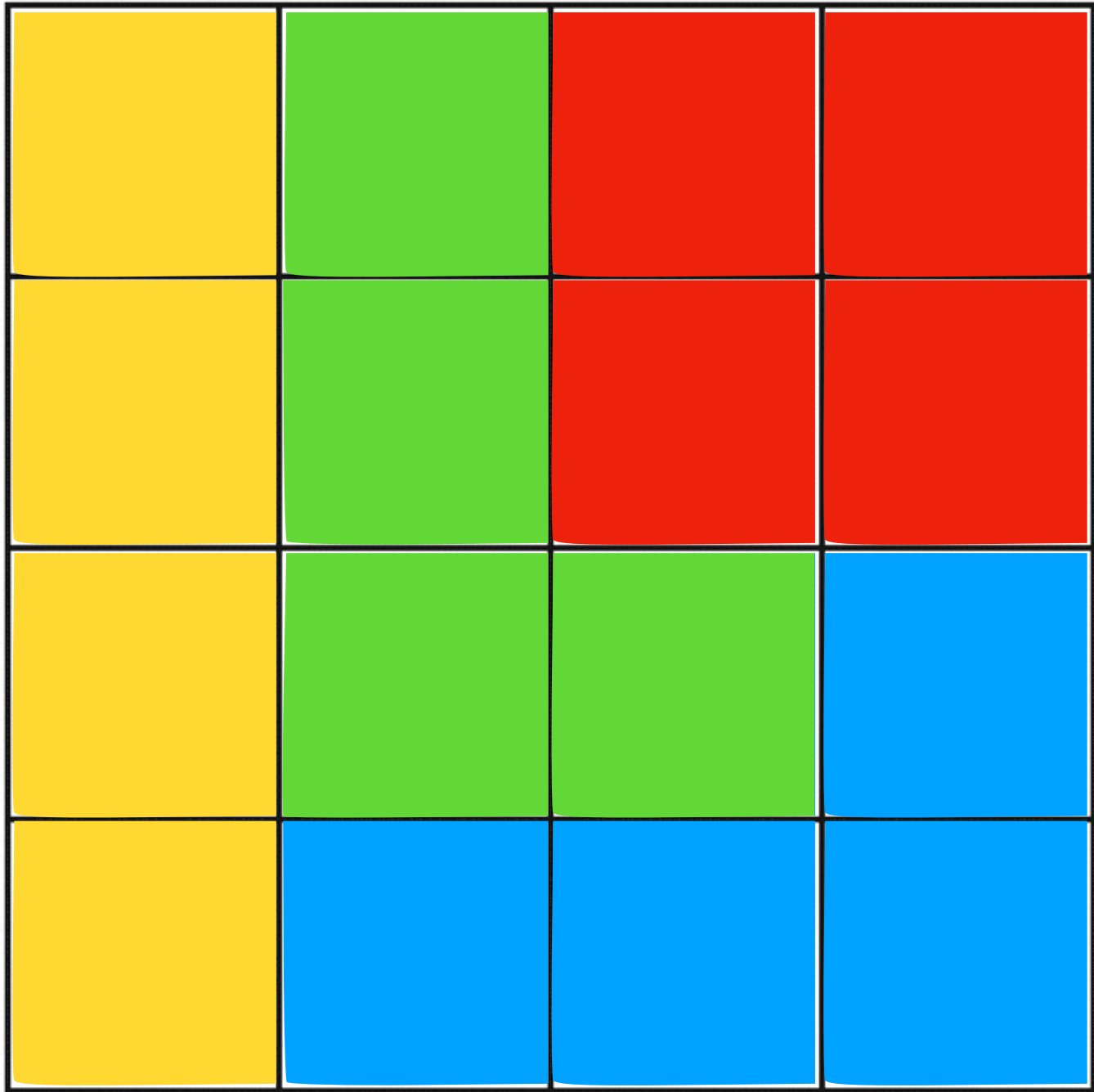
$$R_k = i_k \longrightarrow R_{k+1} = i_{k+1}$$

$$\mathbf{P} \left( R_{k+1} = i_{k+1} \mid R_k = i_k, R_{k-1} = i_{k-1}, \dots \right)$$

$$= \mathbf{P} \left( R_{k+1} = i_{k+1} \mid R_k = i_k \right)$$

this is the concept foundational to GerryChain.

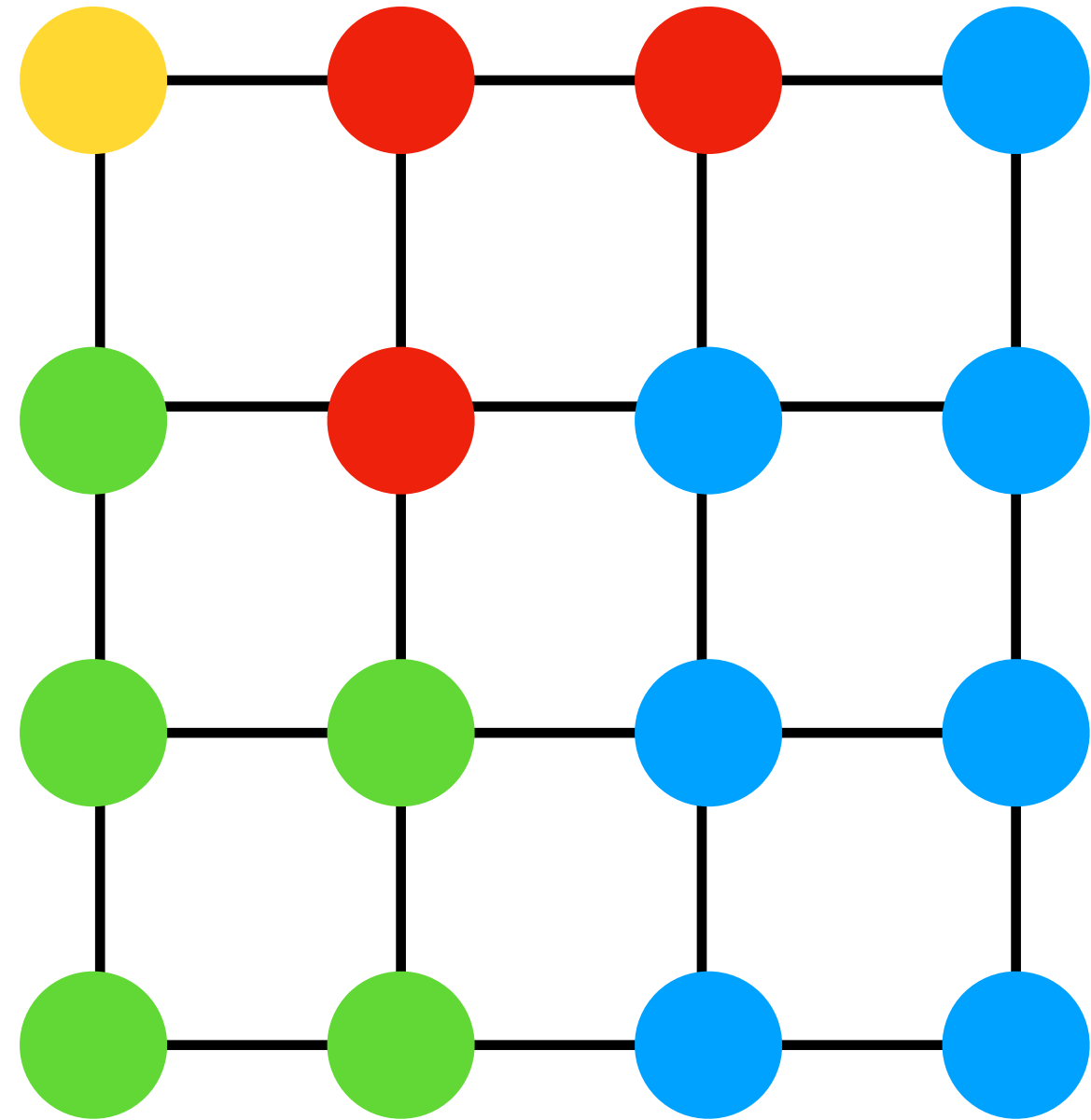


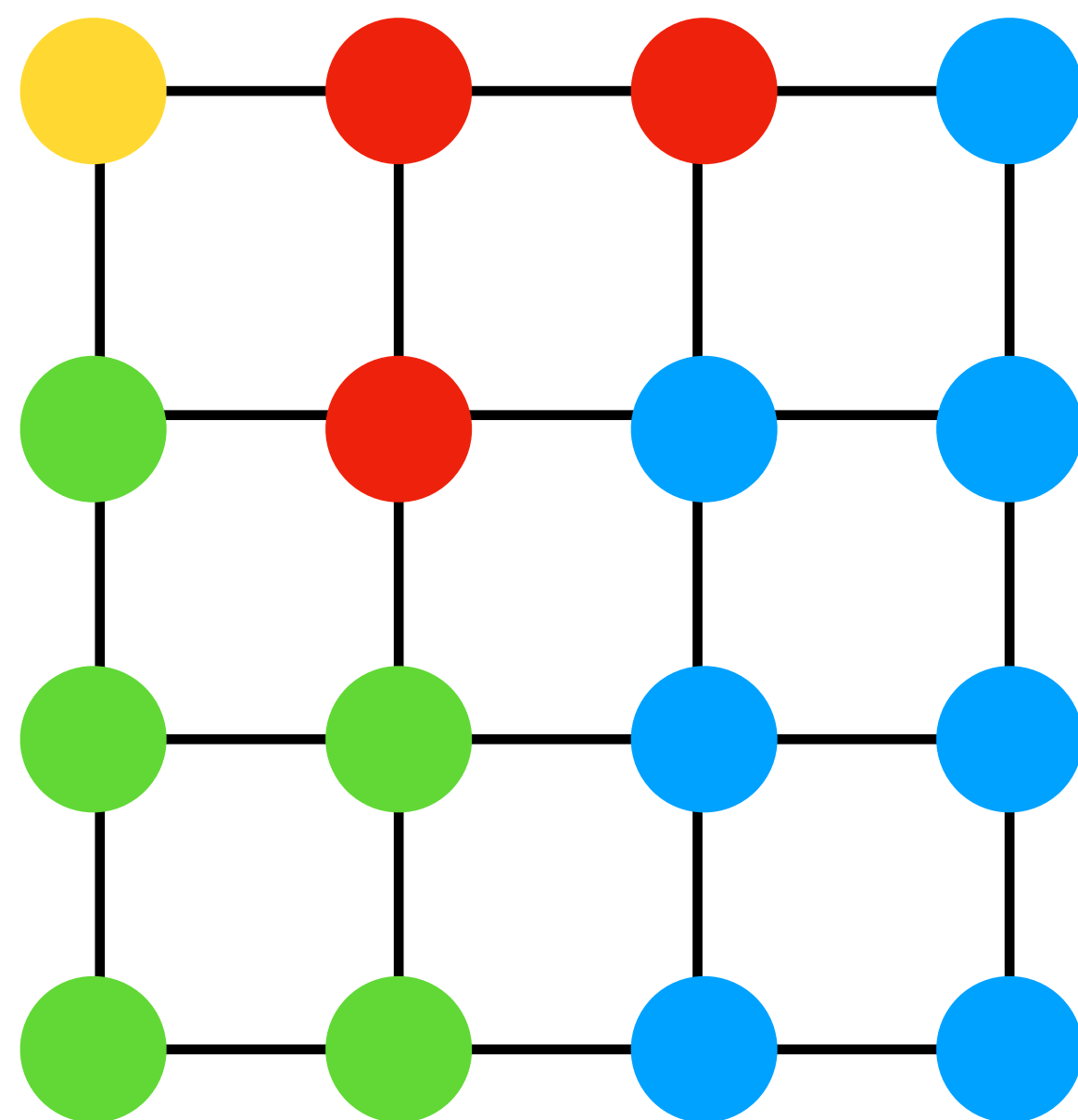
4	1	1	1
1	2	1	0
1	1	1	0
1	0	0	1

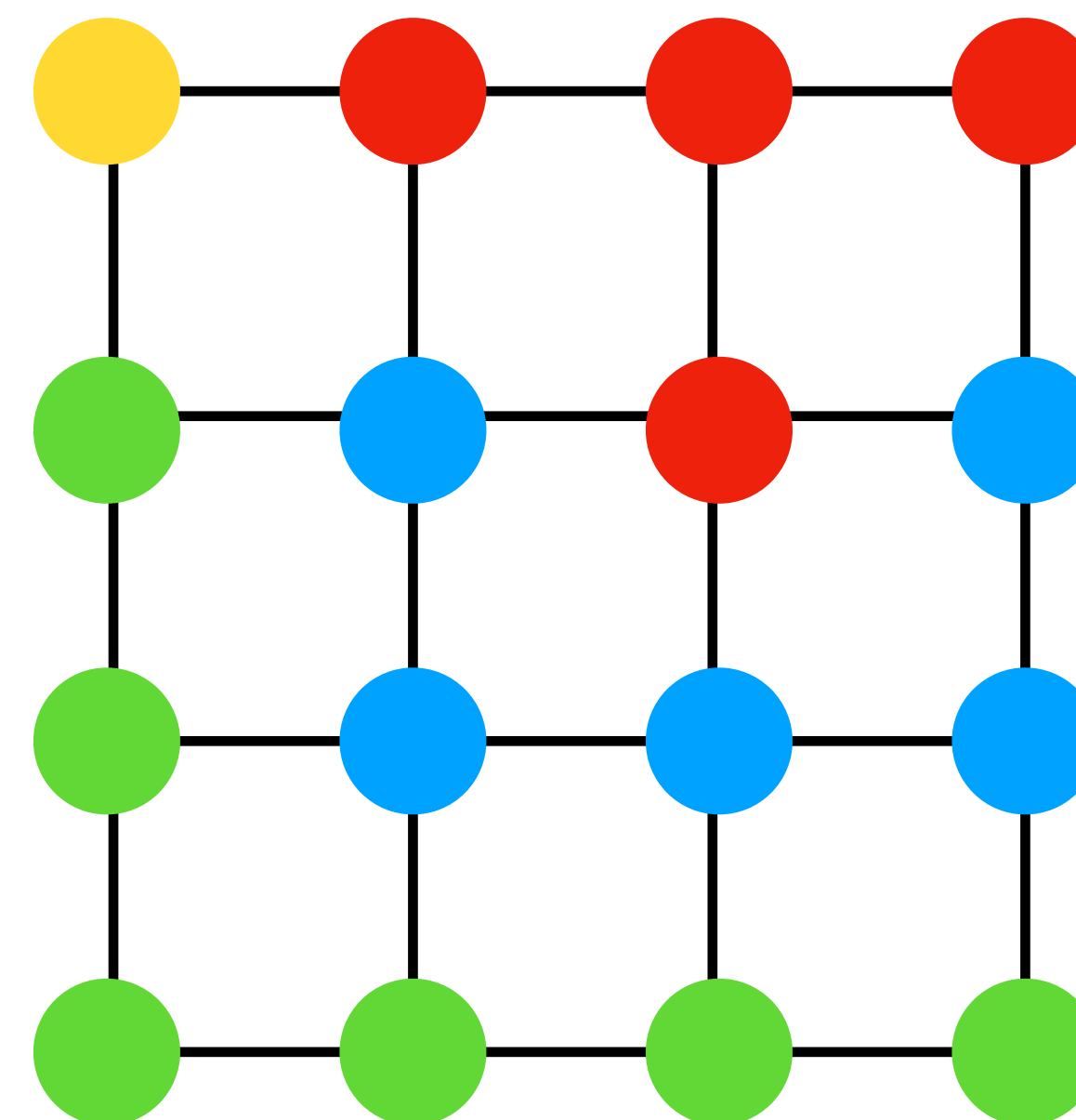
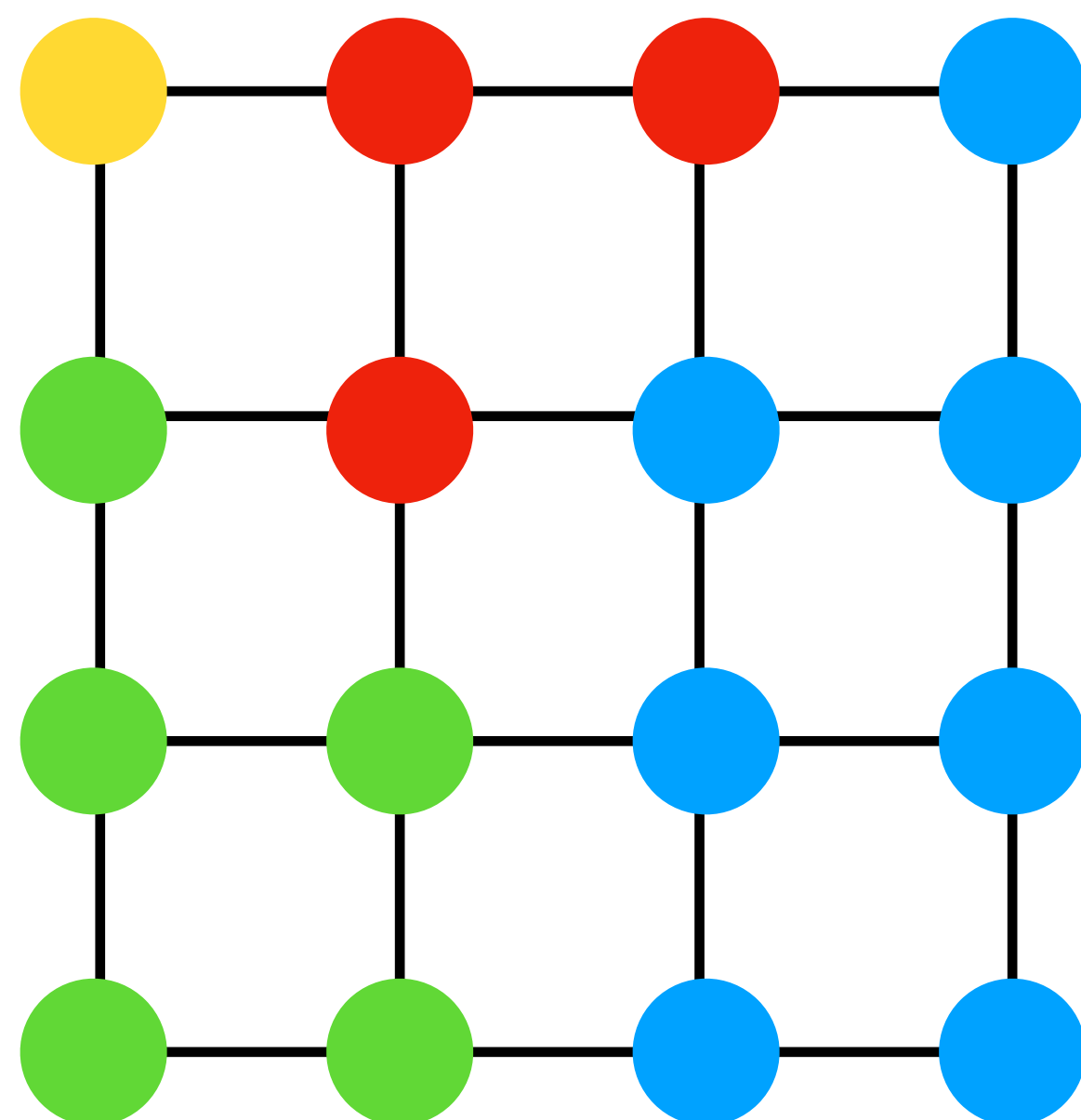


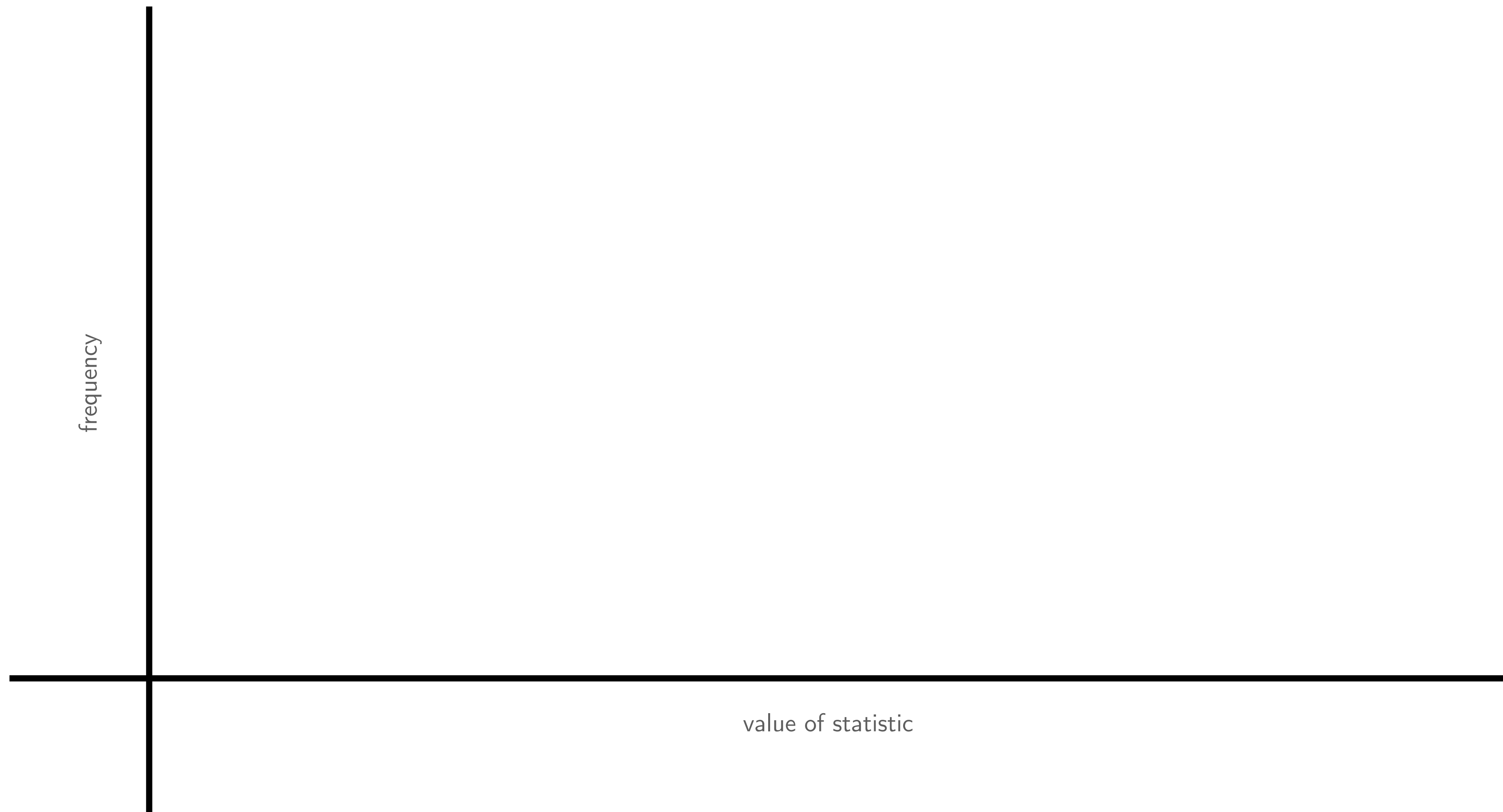
4	1	1	1
1	2	1	0
1	1	1	0
1	0	0	1

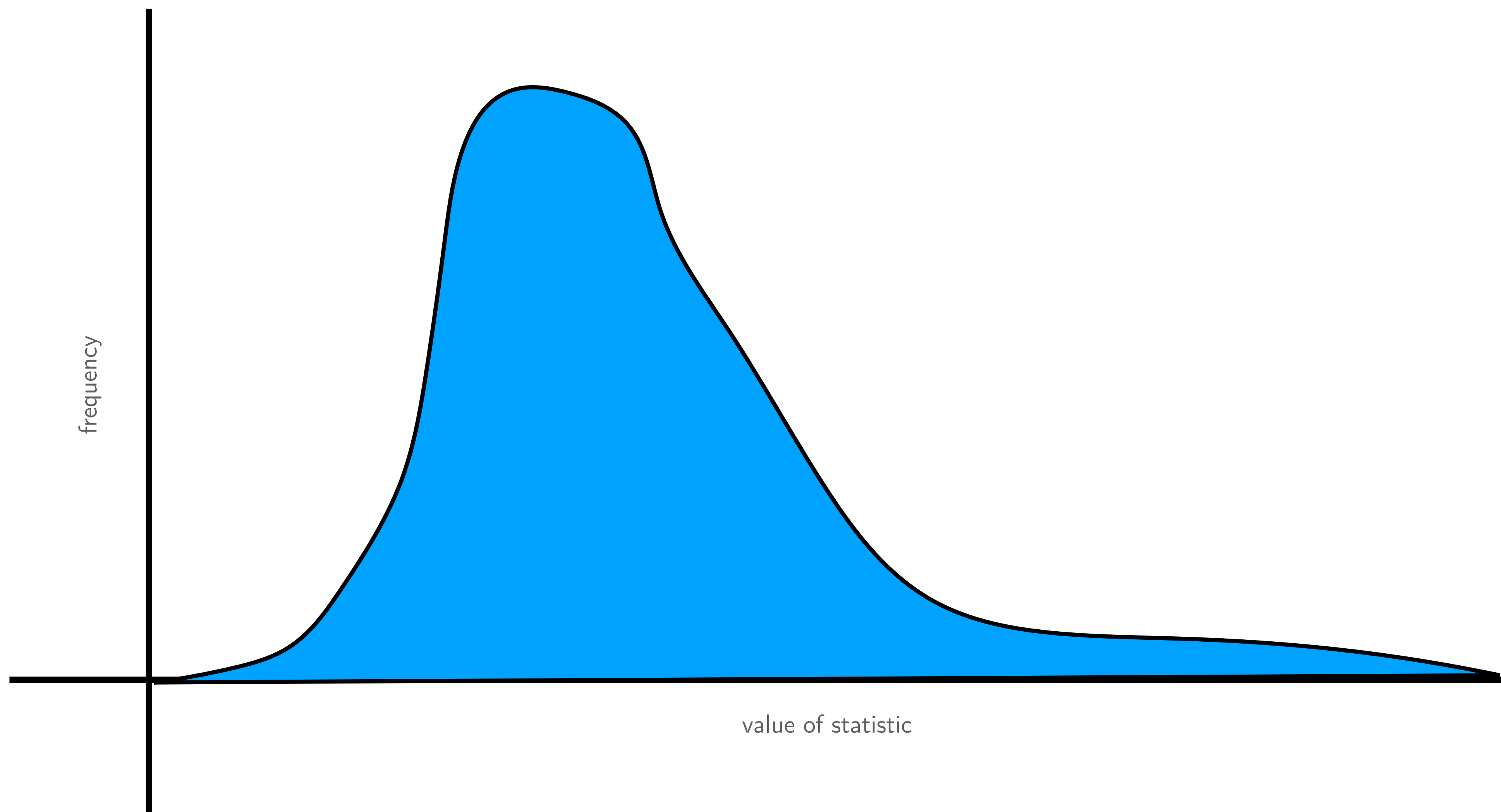
4	1	1	1
1	2	1	0
1	1	1	0
1	0	0	1

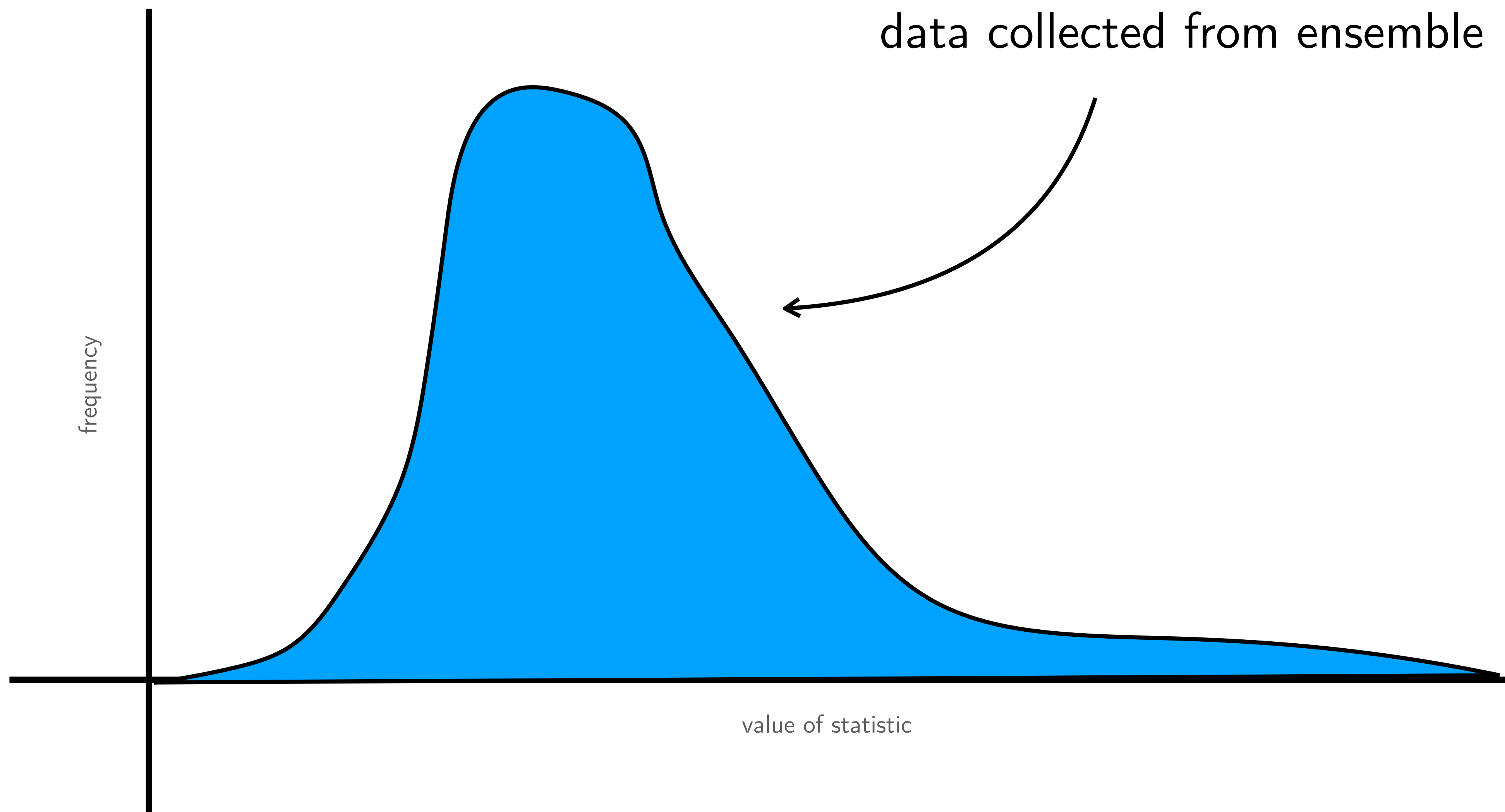


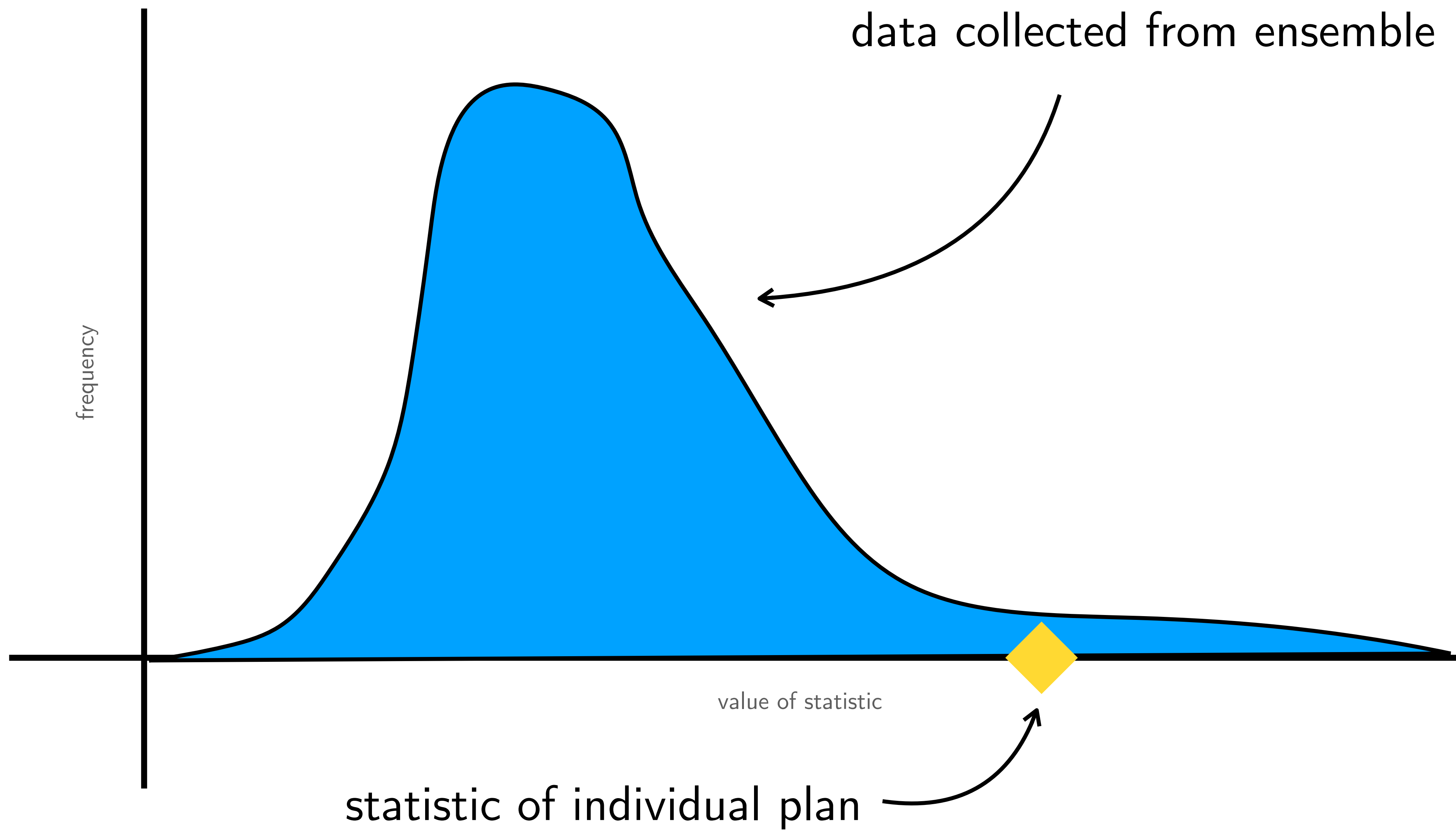














applying this technique to redistricting is fairly revolutionary.

### 3. contemporary research

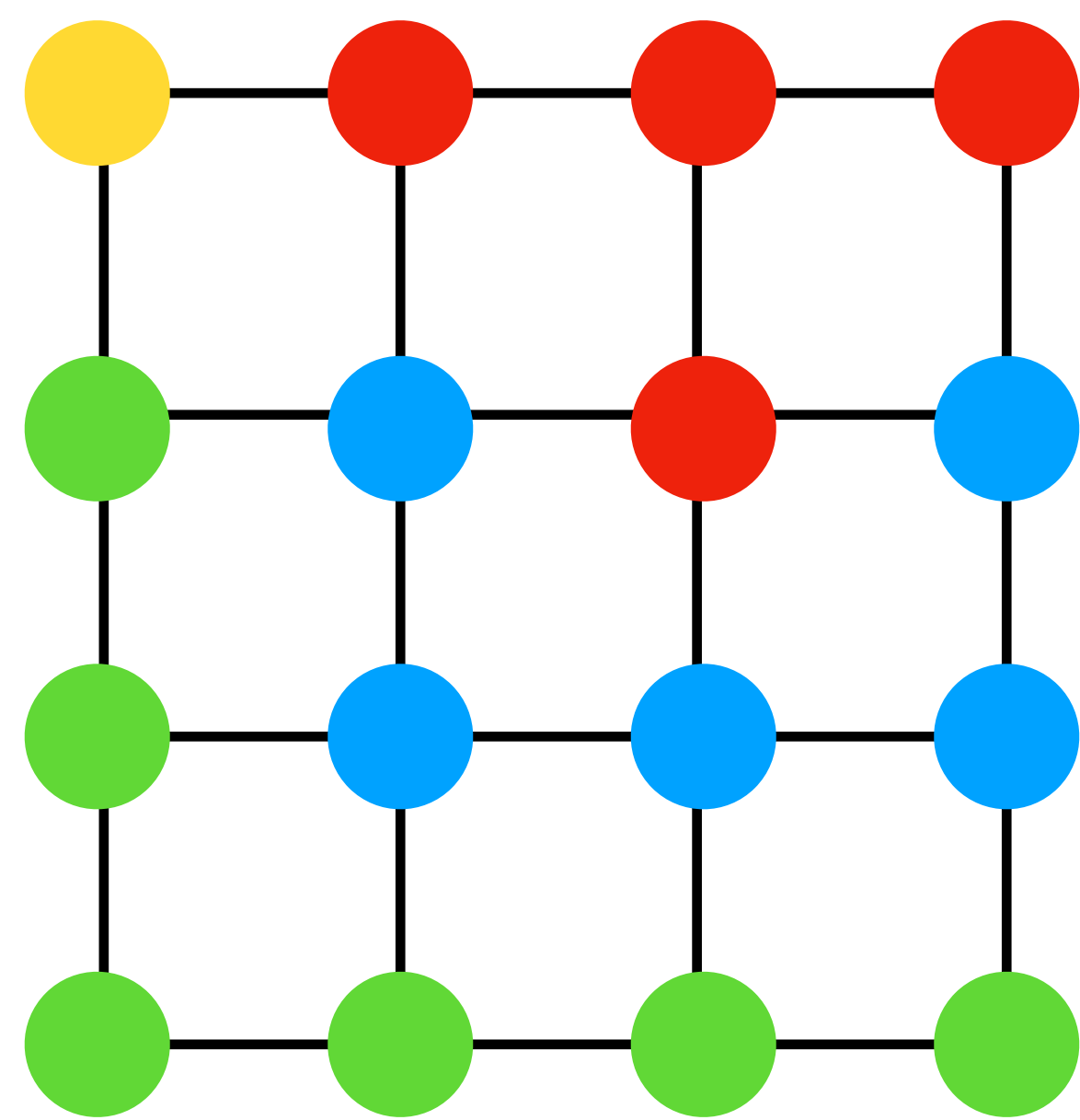
proposal and acceptance methods for Markov chains on graphs.

**ReCom**

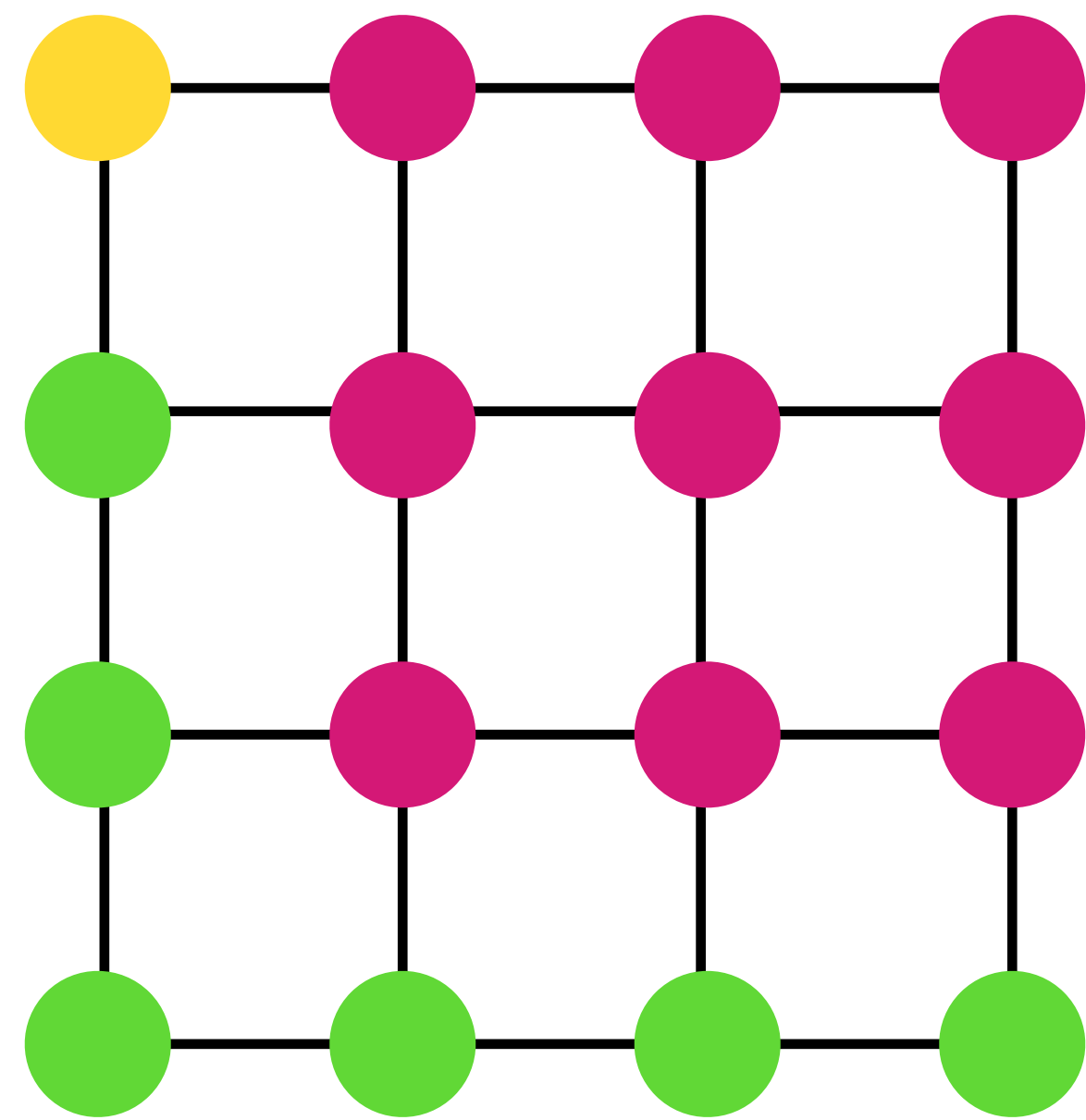
## **ReCom**

**ReCombination**, borrowed from molecular biology.

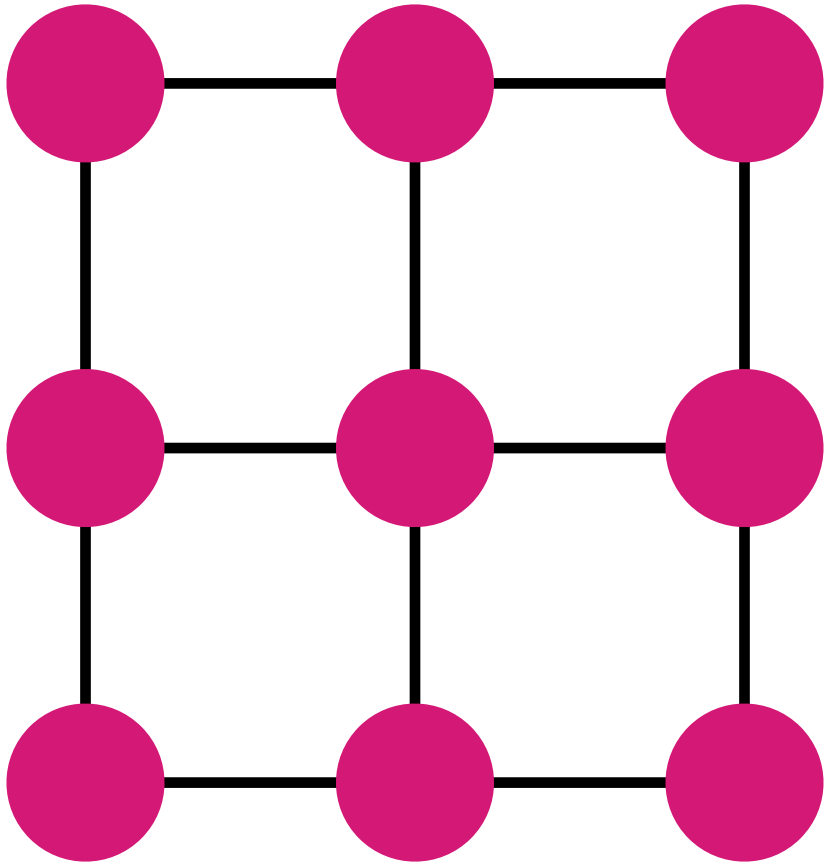
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1	2	1	0
1	1	1	0
1	0	0	1



4	1	1	1
1	2	1	0
1	1	1	0
1	0	0	1

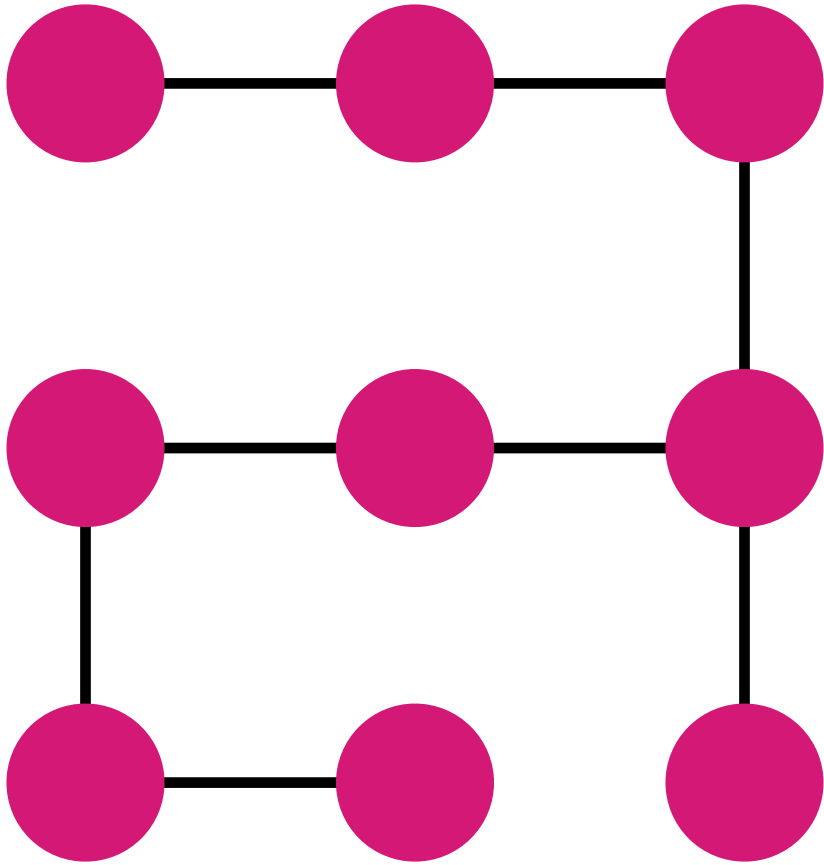


4	1	1	1
1	2	1	0
1	1	1	0
1	0	0	1

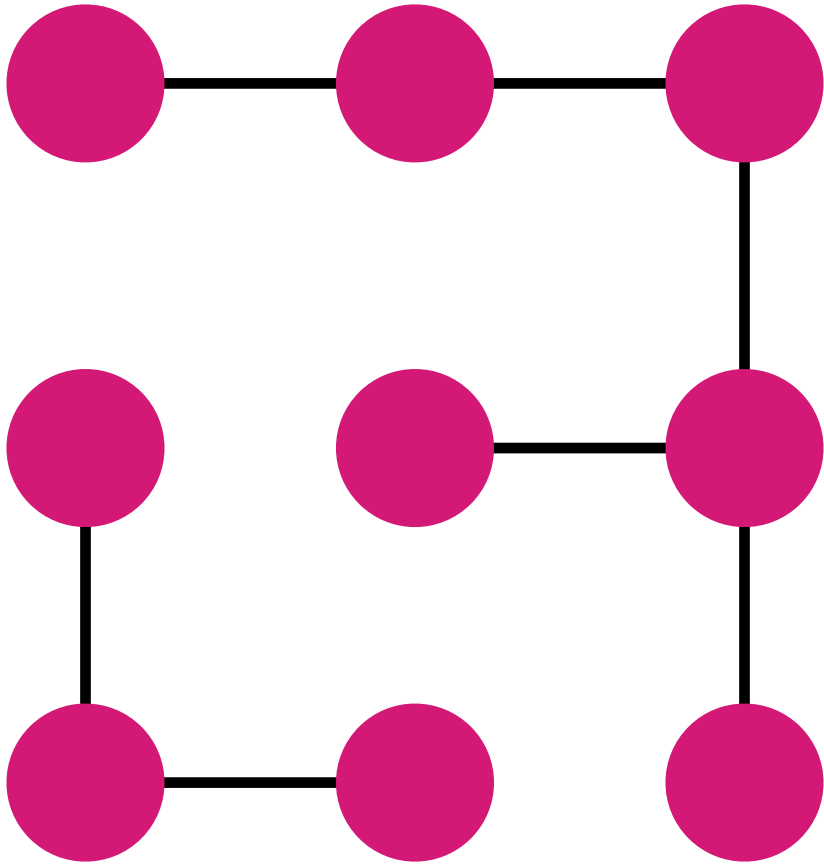




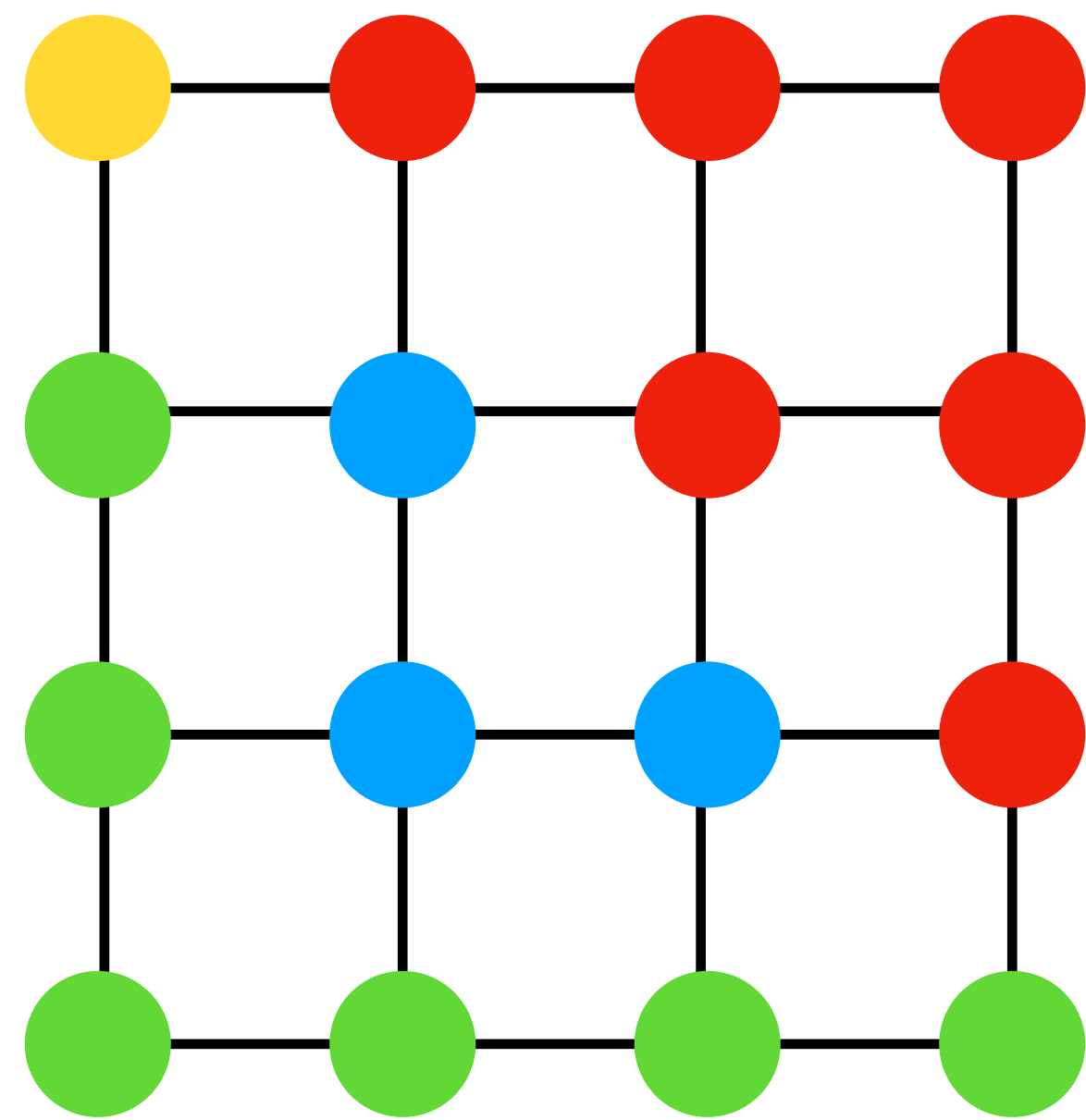
4	1	1	1
1	2	1	0
1	1	1	0
1	0	0	1



4	1	1	1
1	2	1	0
1	1	1	0
1	0	0	1



4	1	1	1
1	2	1	0
1	1	1	0
1	0	0	1



$$S : \mathcal{P} \rightarrow [0,1]$$

$$\mathbf{P}(P^*) = \frac{S(P^*)}{\sum_{p \in \mathcal{P}} S(p)}$$

$$\frac{\mathbf{P}(P^*)}{\mathbf{P}(P)} = \frac{\frac{S(P^*)}{\sum_{p \in \mathcal{P}} S(p)}}{\frac{S(P)}{\sum_{p \in \mathcal{P}} S(p)}} = \frac{S(P^*)}{S(P)}$$

$$\alpha = \min \left( \frac{S(P^*)}{S(P)}, 1 \right)$$

$$\beta \in [0,1]$$

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$$\alpha = \min \left( \frac{S(P^*)}{S(P)}, 1 \right)$$

$$\beta \in [0,1]$$



and that's it.

4. things that are hard



a. aperiodic

- a. aperiodic
- b. irreducible



- a. aperiodic
- b. irreducible
- c. reversible

**aperiodic**

**aperiodic**

when a Markov chain doesn't return to any one state with regularity.

$$\mathbf{period}(P) = \gcd \{ \text{the step numbers where we hit } P \}$$

**irreducible**

**irreducible**

we can get from any state to any other state.

$$\forall P, P^* \in \mathcal{P}, \exists n \text{ such that } \mathbf{P} \left( R_{k+n} = P^* \mid R_k = P \right) > 0$$

**reversible**



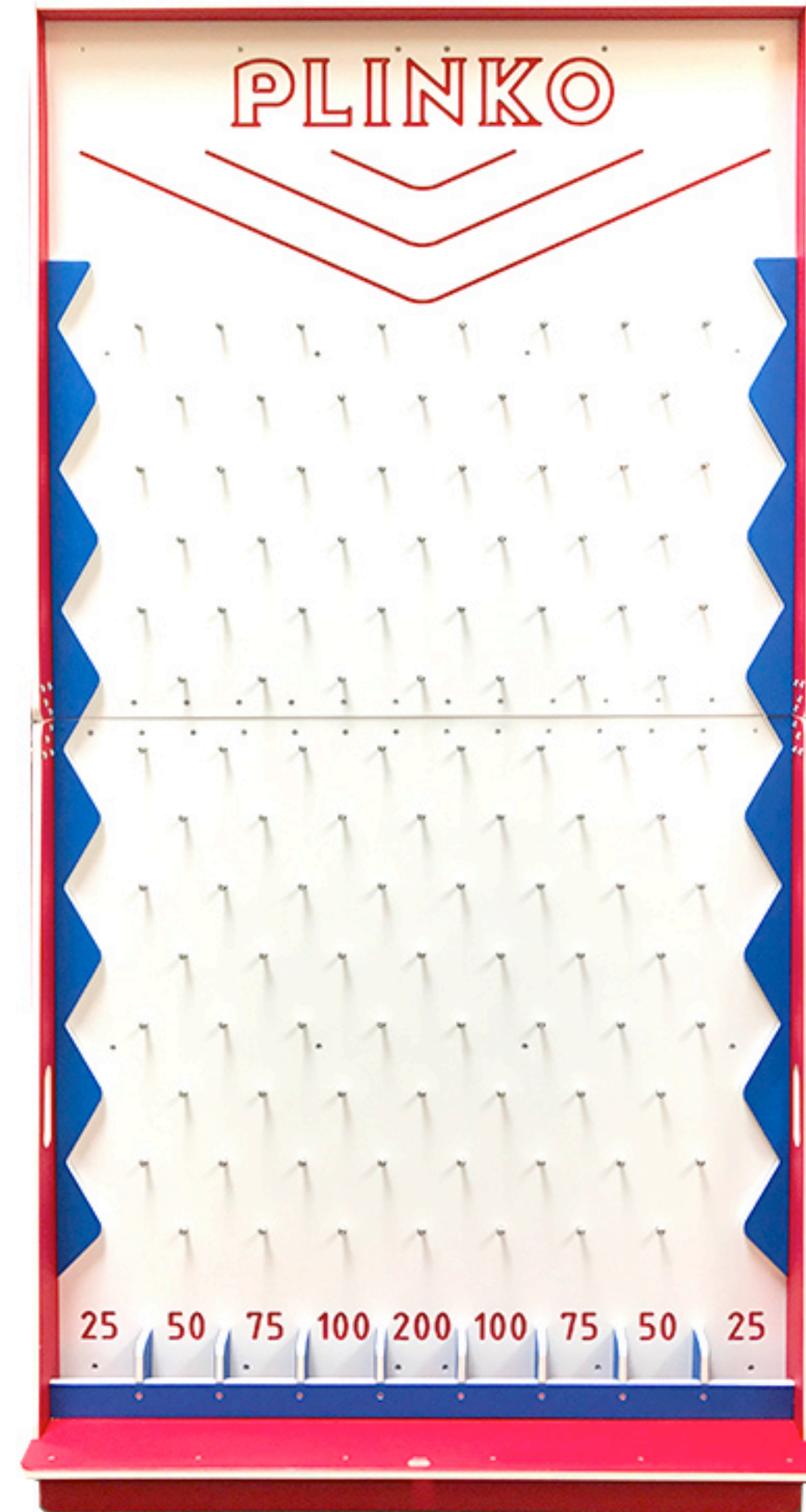
## **reversible**

when we hit our *steady state*, the chance we move between two states is the same either way.

**steady state**

## **steady state**

the limit of the distributions of our samples as our step number goes to infinity



$$\mathbf{P}(R_{m+1} = P^* \mid R_m = P) = \mathbf{P}(R_{m+1} = P \mid R_m = P^*)$$

we know our Markov chain *can* be reversible.

$$\alpha = \min \left( \frac{S(P^*)}{S(P)} \cdot \frac{T_{P^* \rightarrow P}}{T_{P \rightarrow P^*}}, 1 \right)$$

we don't know whether they're aperiodic or irreducible.



where does this leave us?

5. where we're hopefully going

civically-minded mathematicians.

combating not-so-great ideas.

redistricting is *too human* for computers to do for us.

use your skills *for good*.

questions?

thank you!