

MINIMIZING INTERFERENCE POTENTIAL AMONG MOVING ENTITIES

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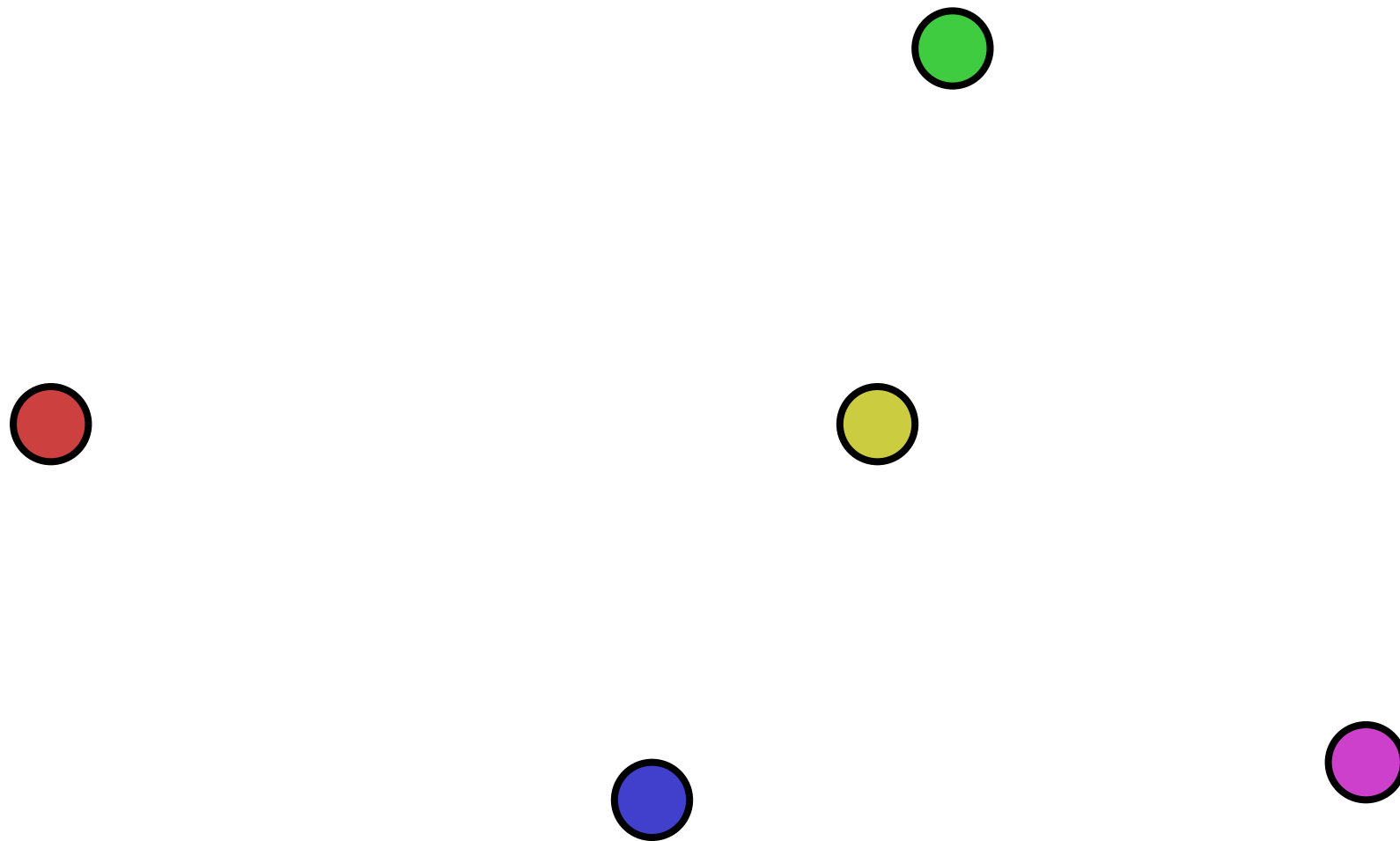
University of British Columbia, Canada

Moving entities

- Airplanes
- Smart phones
- Mobile transmitters

Equi-sized balls in \mathbb{R}^d that move with bounded speed.

Suppose we know their positions now.

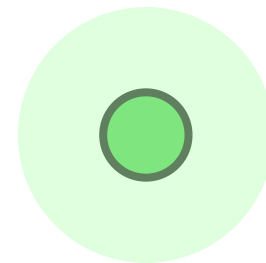
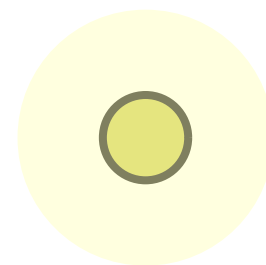
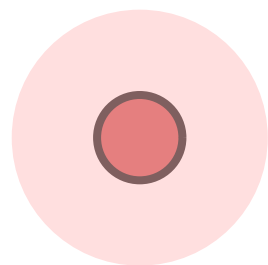


Moving entities

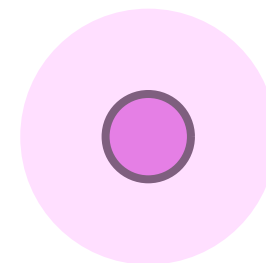
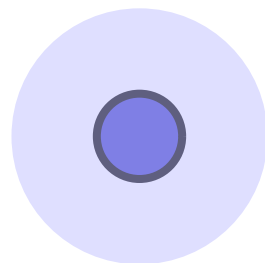
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Suppose we know their positions now.



potential locations
1 time step later

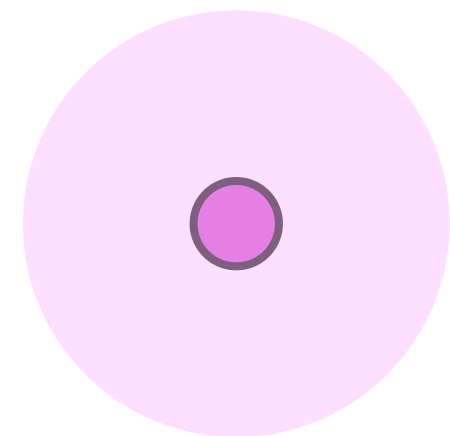
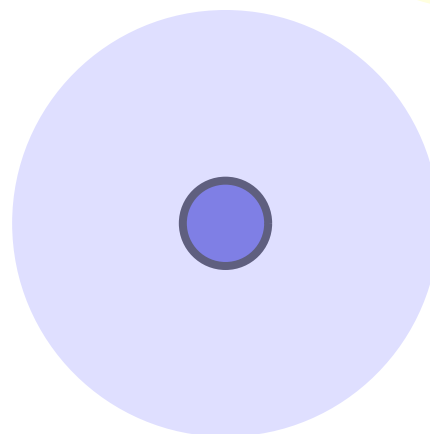
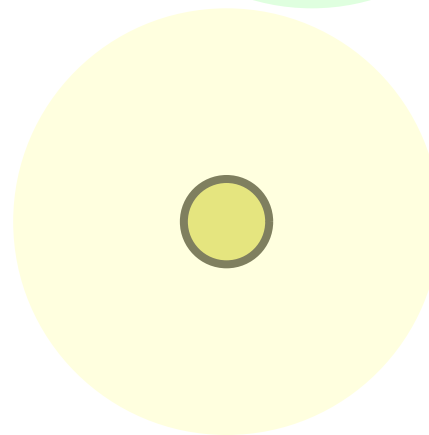
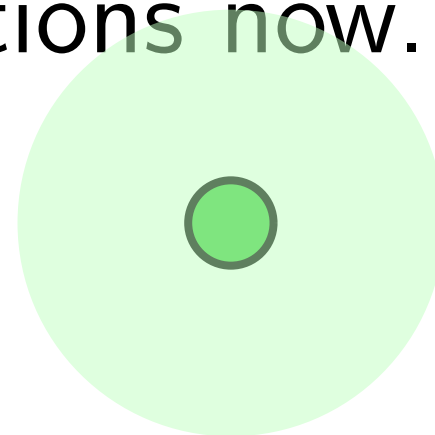
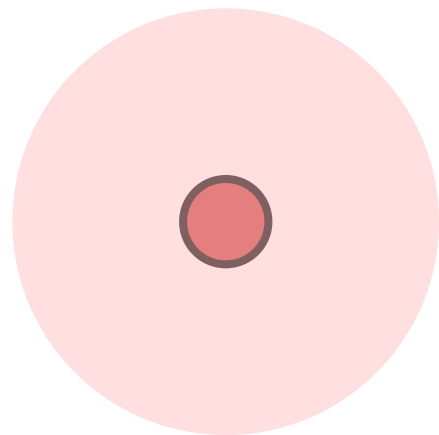


Moving entities

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Equi-sized balls in \mathbb{R}^d that move with bounded speed.

Suppose we know their positions now.



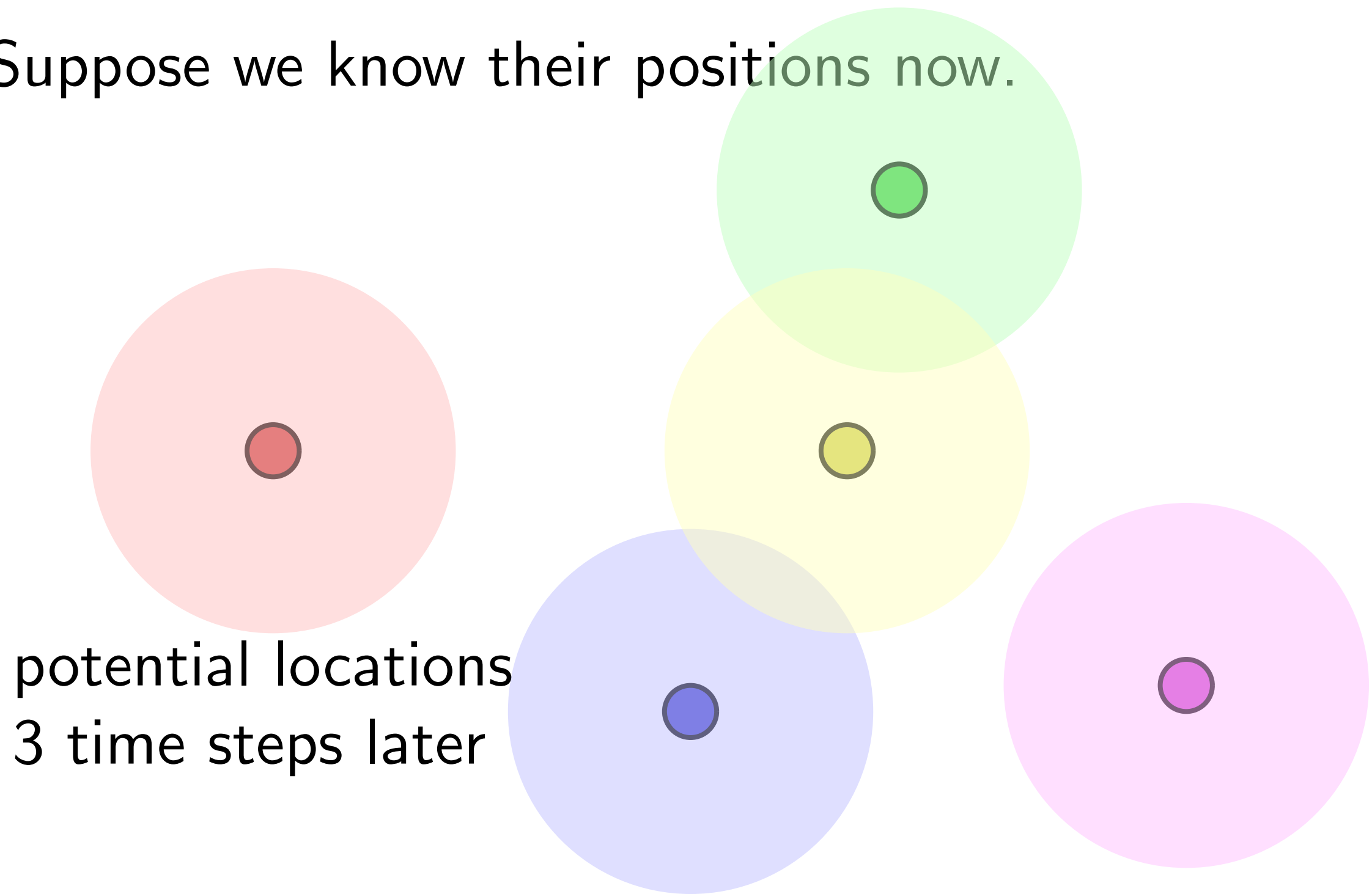
potential locations
2 time steps later

Moving entities

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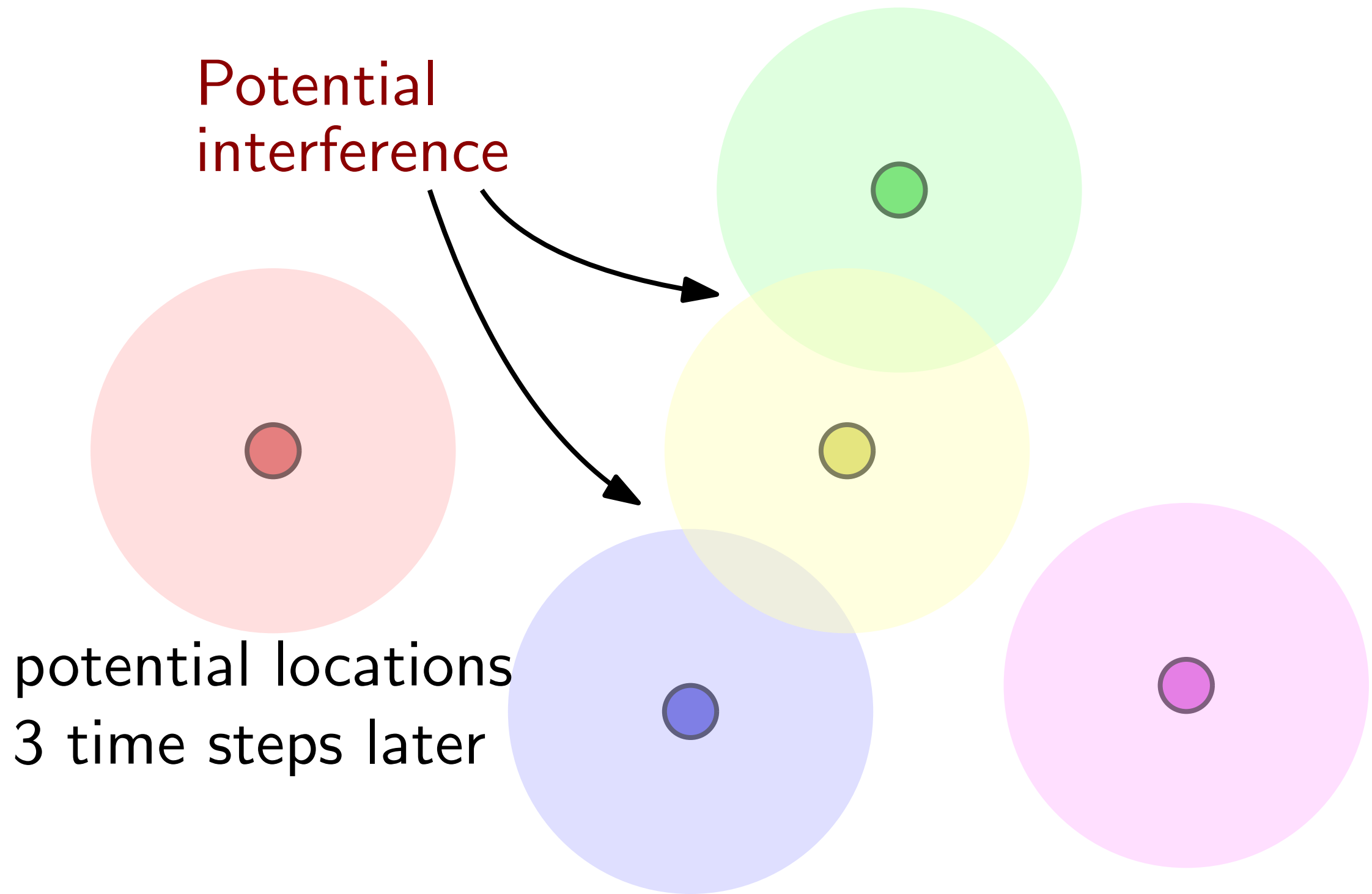
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Moving entities

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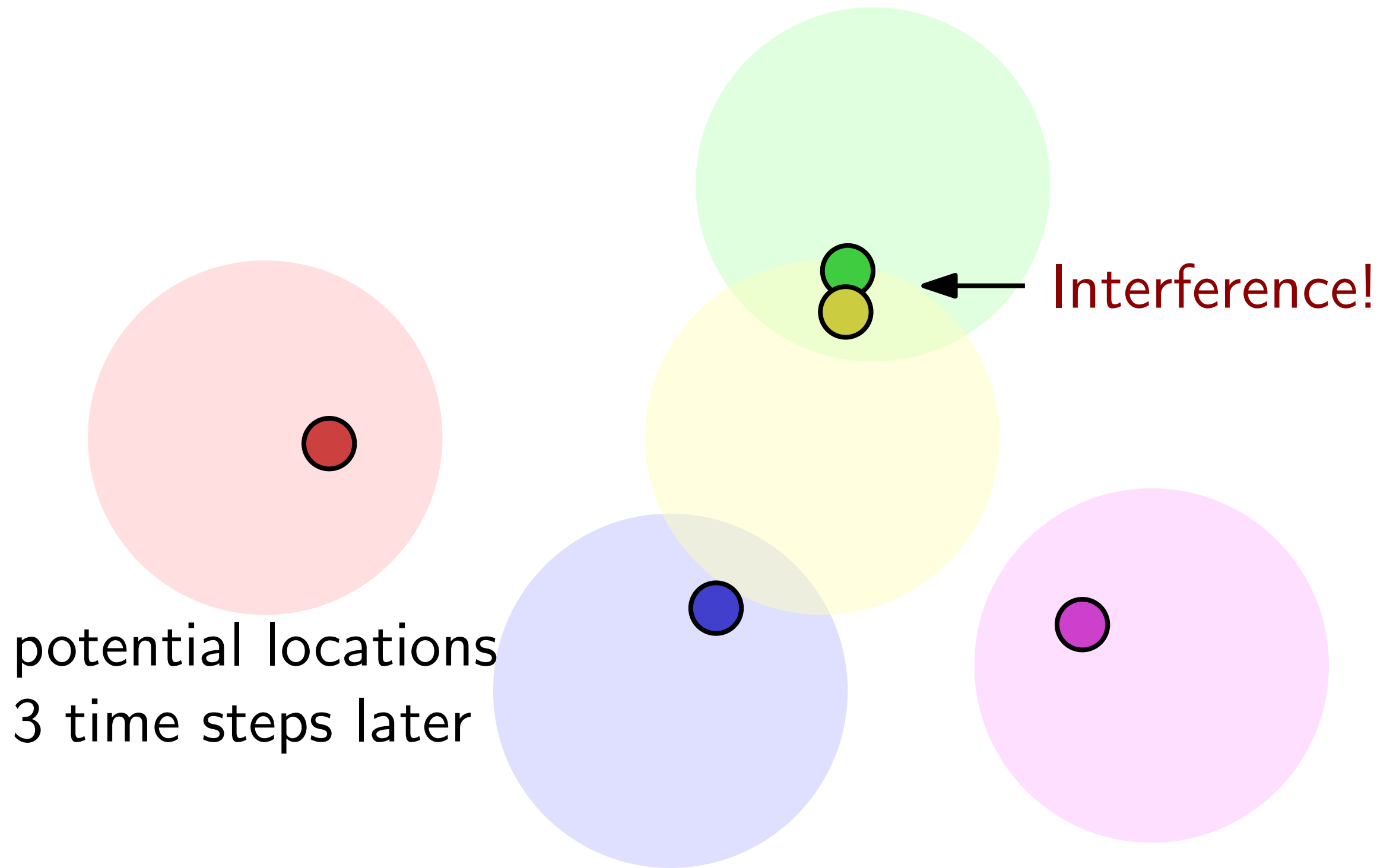
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Moving entities

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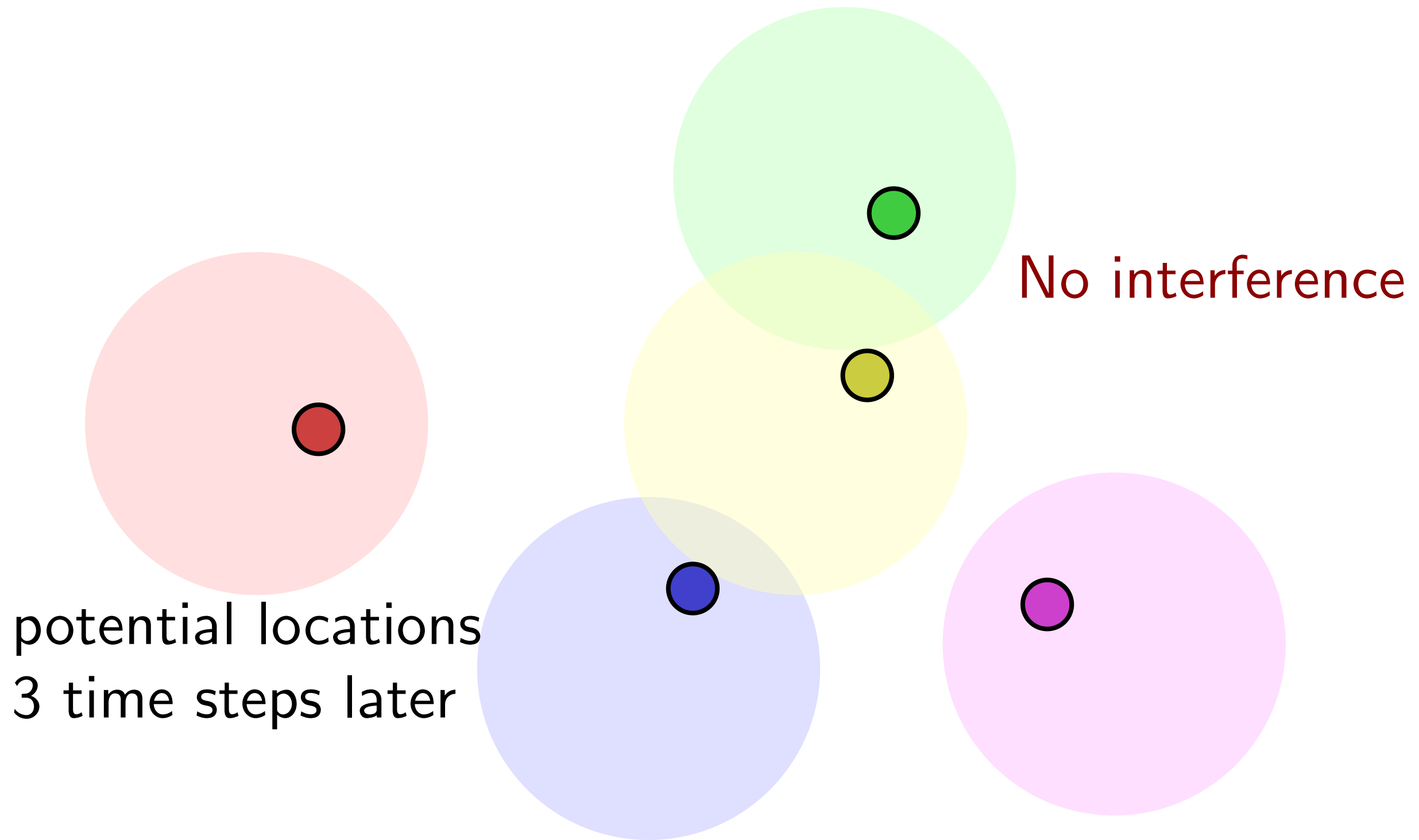
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Goal: Minimize potential interference

How: Query one entity per time step for its position



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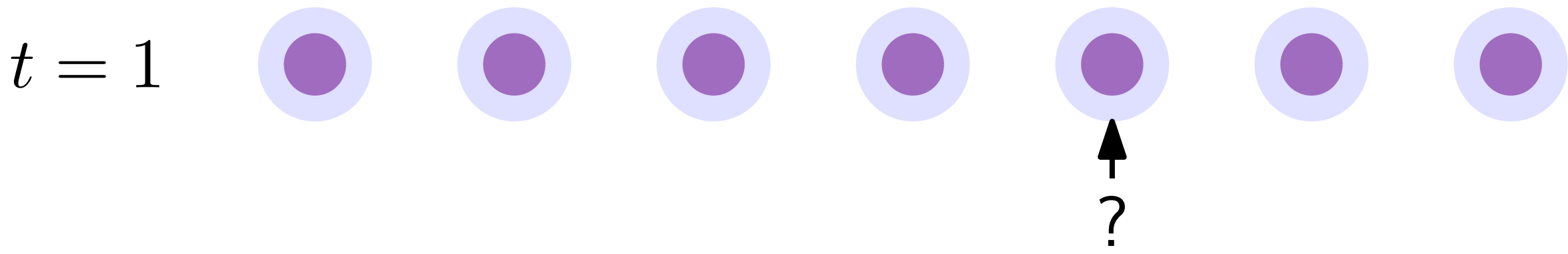
How: Query one entity per time step for its position

$t = 0$



Goal: Minimize potential interference

How: Query one entity per time step for its position



Goal: Minimize potential interference

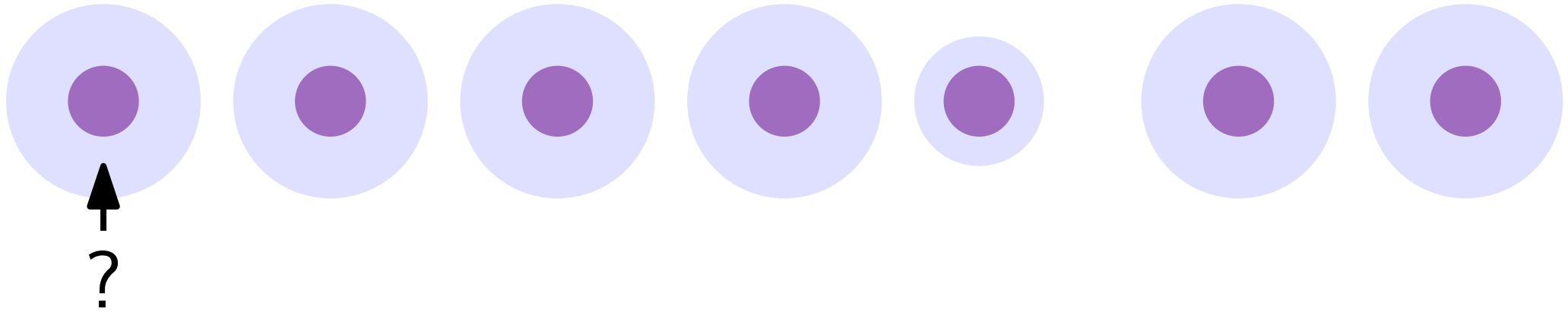
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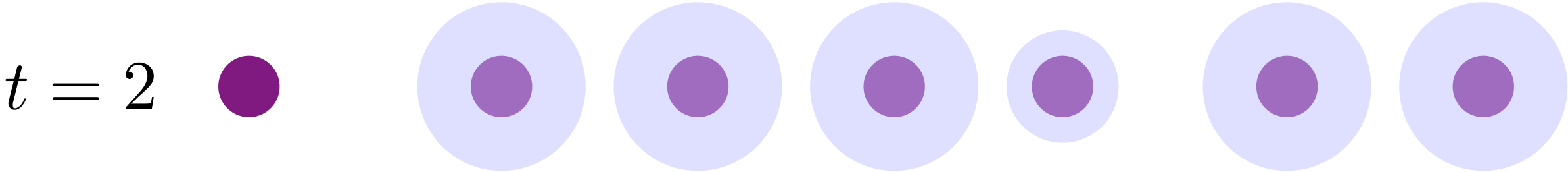
How: Query one entity per time step for its position

$t = 2$



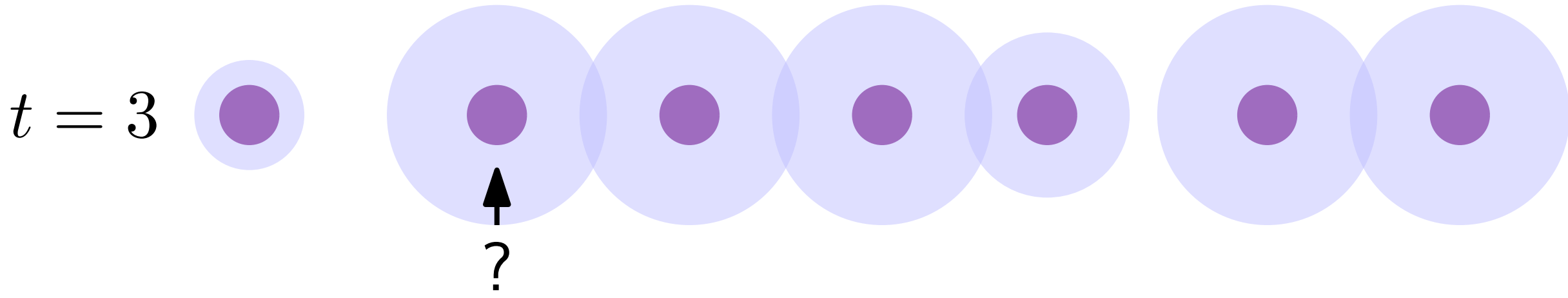
Goal: Minimize potential interference

How: Query one entity per time step for its position



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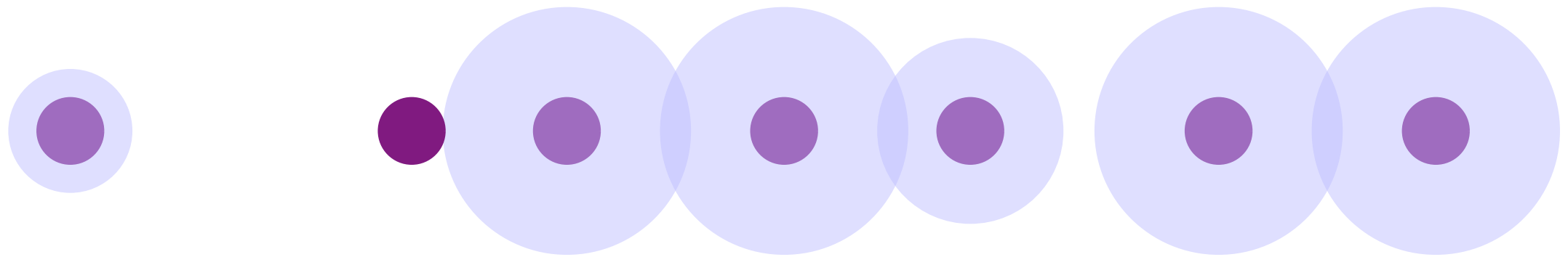
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Goal: Minimize potential interference

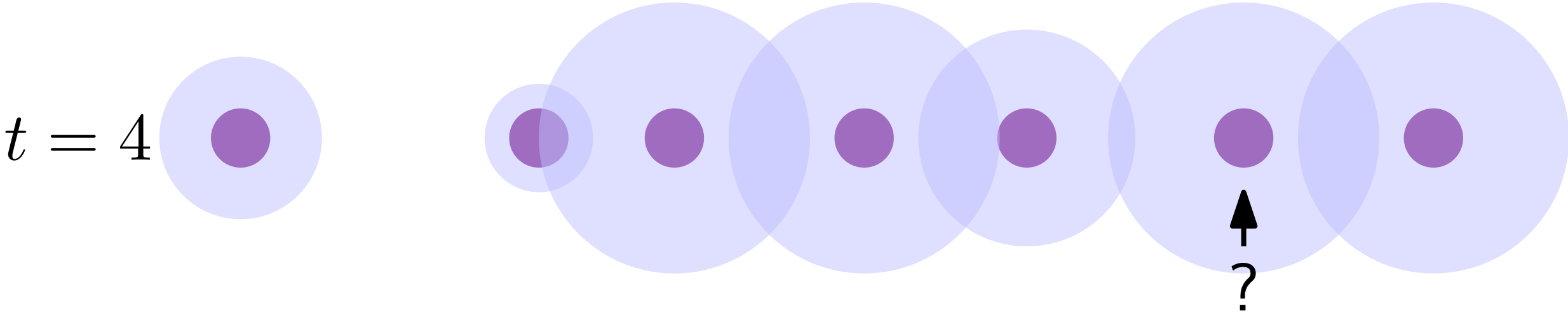
How: Query one entity per time step for its position

$t = 3$



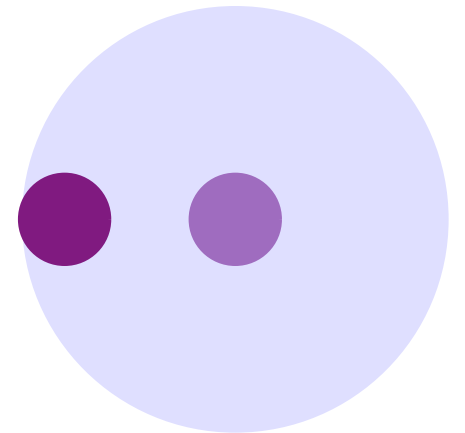
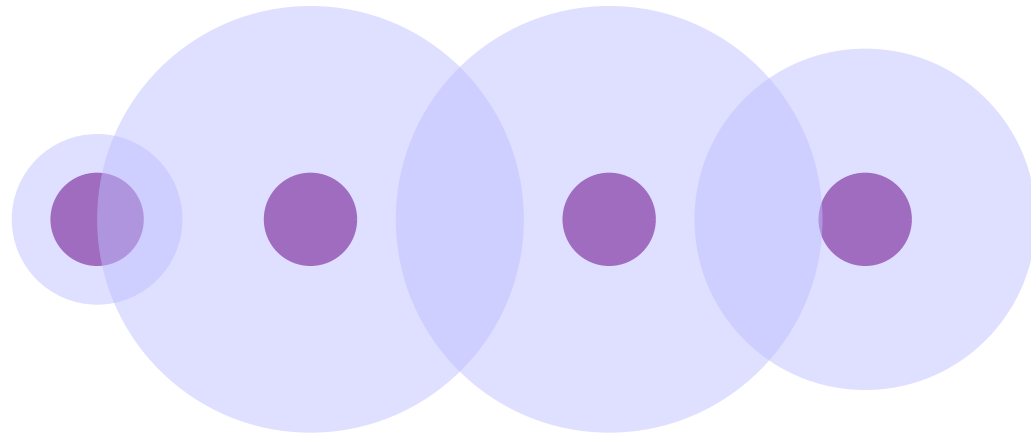
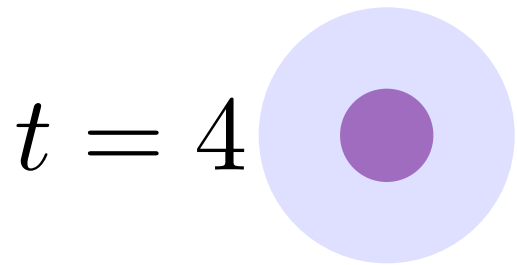
Goal: Minimize potential interference

How: Query one entity per time step for its position



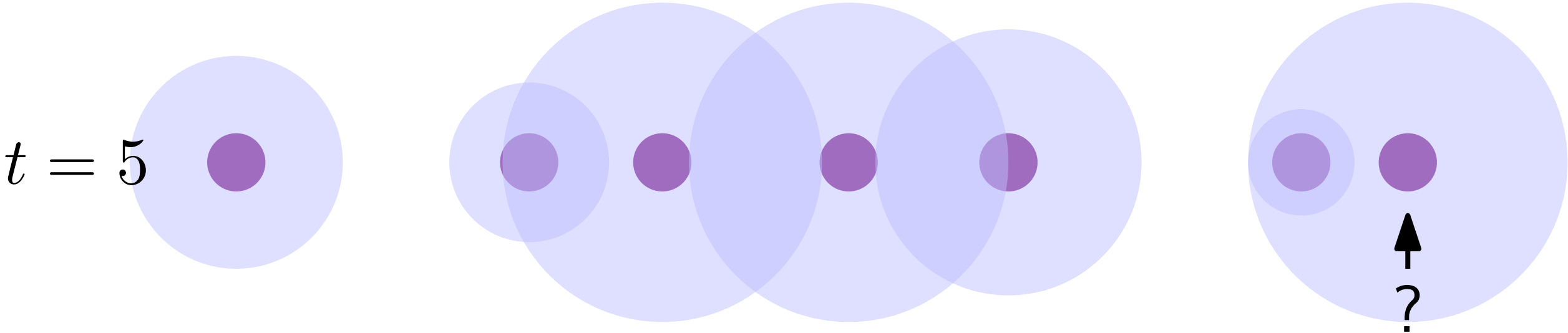
Goal: Minimize potential interference

How: Query one entity per time step for its position



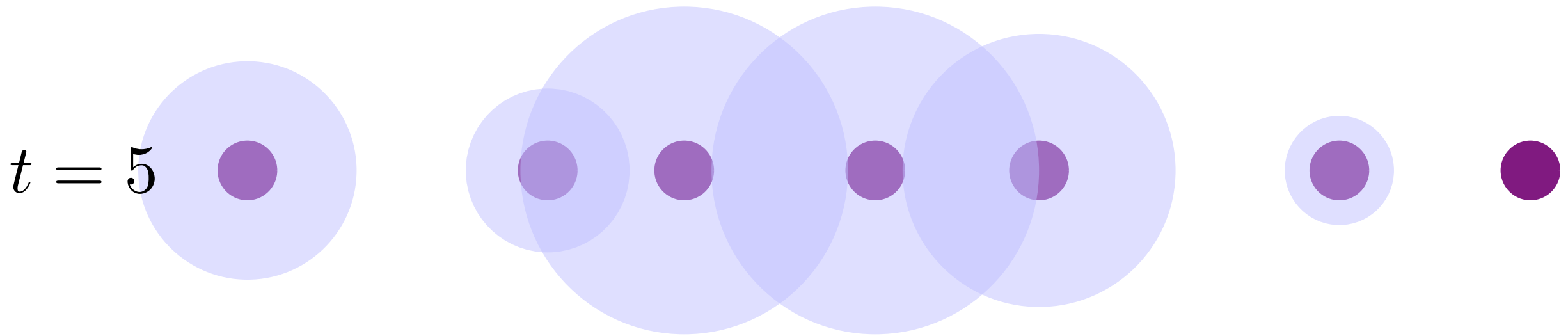
Goal: Minimize potential interference

How: Query one entity per time step for its position



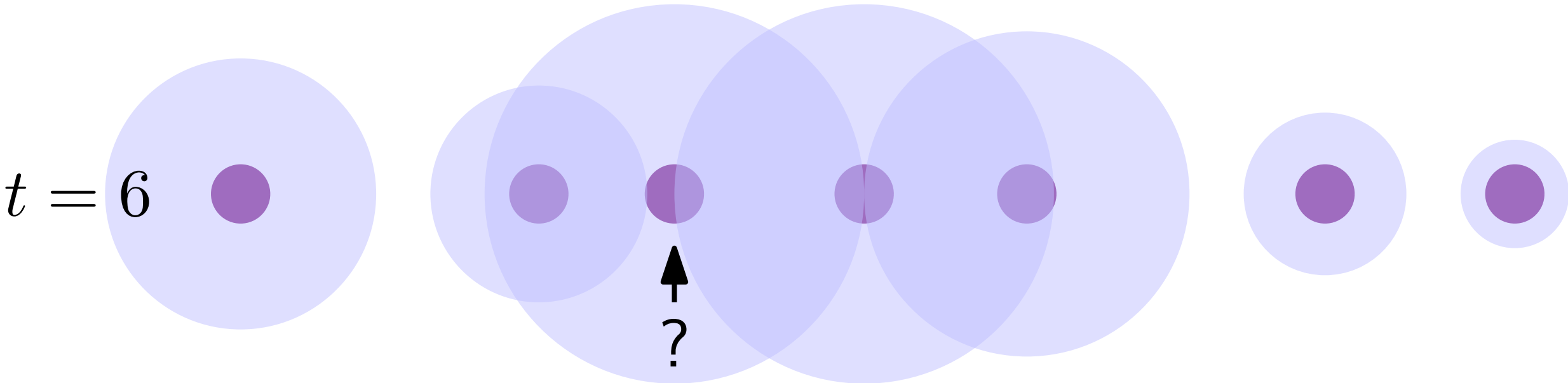
Goal: Minimize potential interference

How: Query one entity per time step for its position



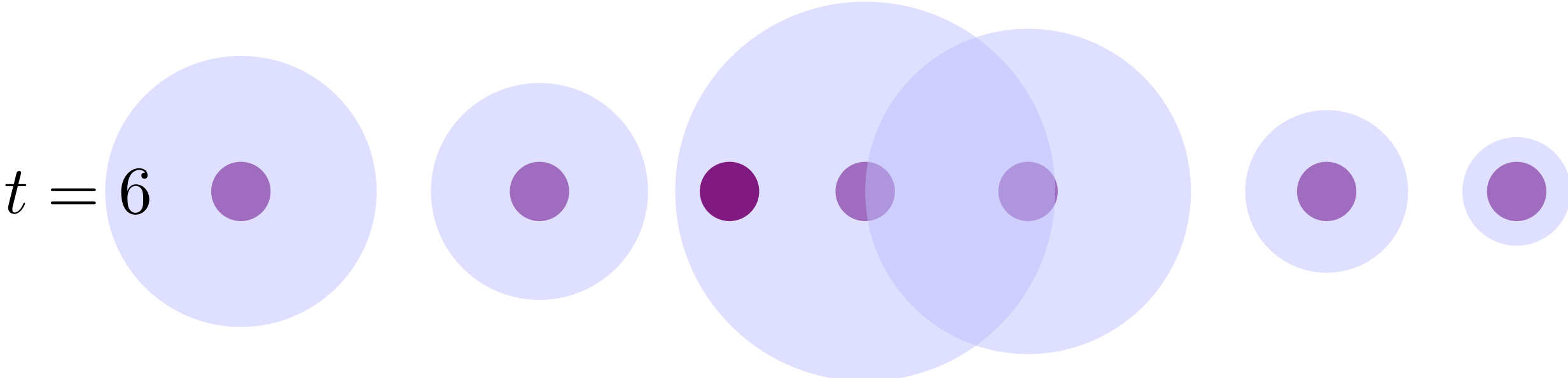
Goal: Minimize potential interference

How: Query one entity per time step for its position



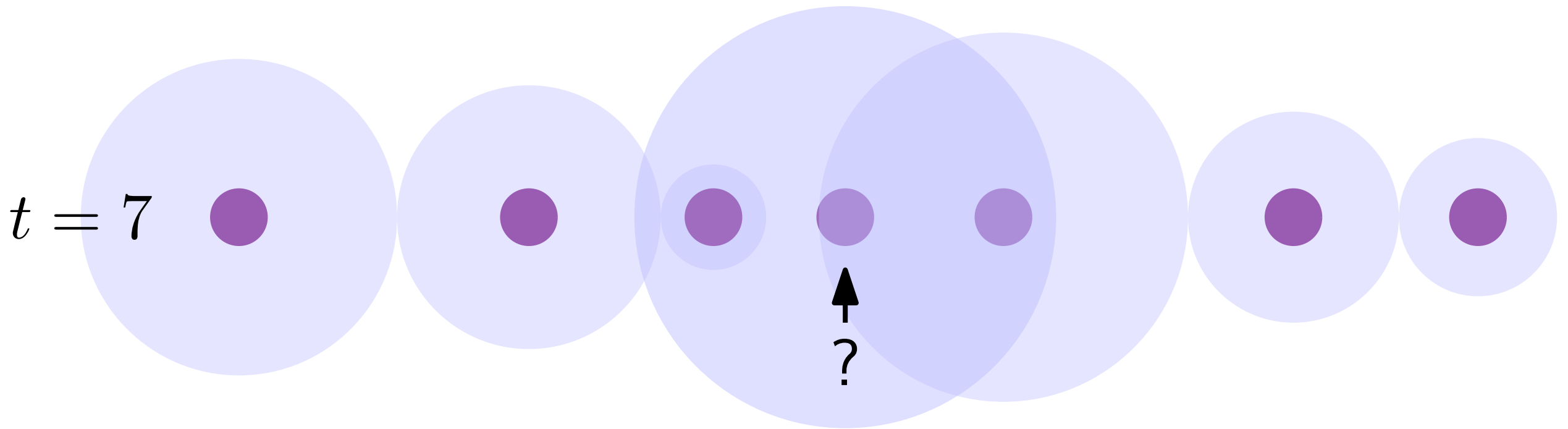
Goal: Minimize potential interference

How: Query one entity per time step for its position



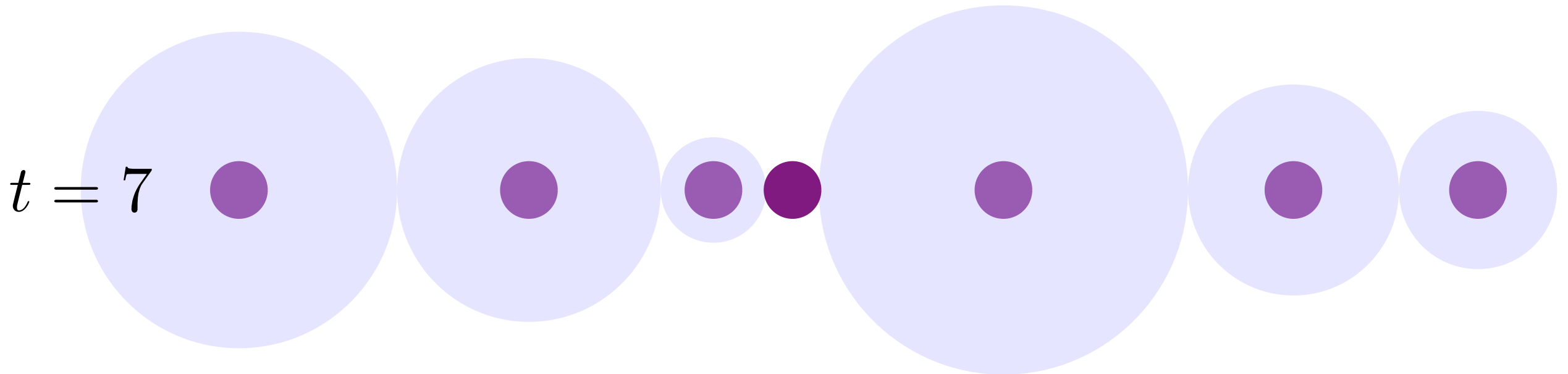
Goal: Minimize potential interference

How: Query one entity per time step for its position



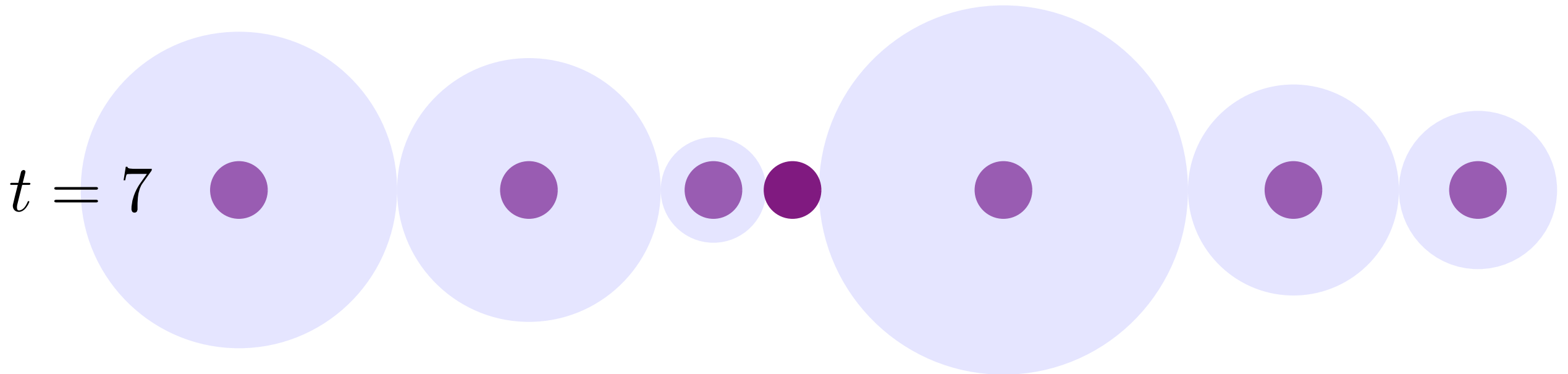
Goal: Minimize potential interference

How: Query one entity per time step for its position



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Related Goals:

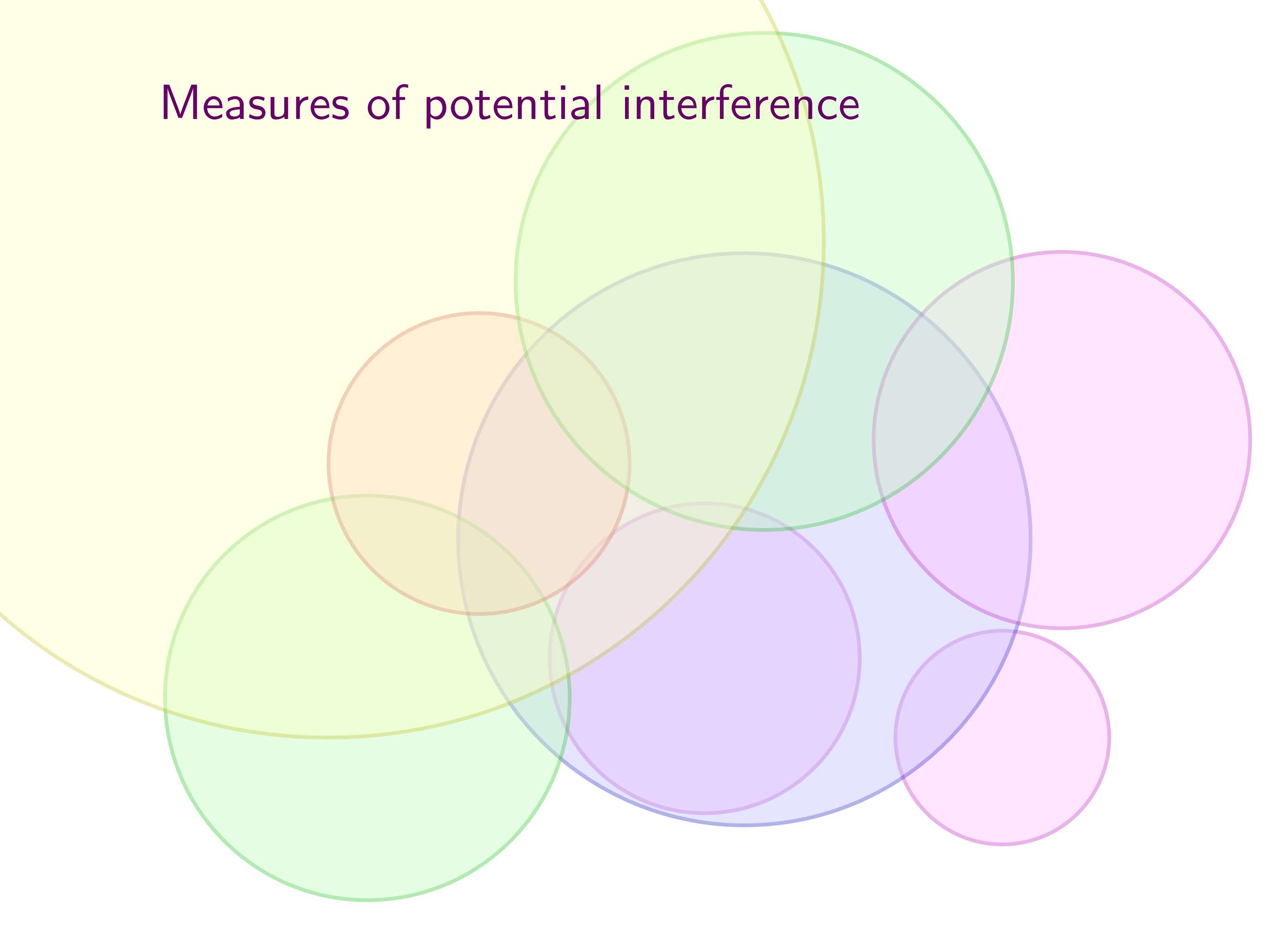
Minimize queries to calculate some function of entities

Kahan '91, Erlebach&Hoffmann '15 (survey)

Query reveals partial information

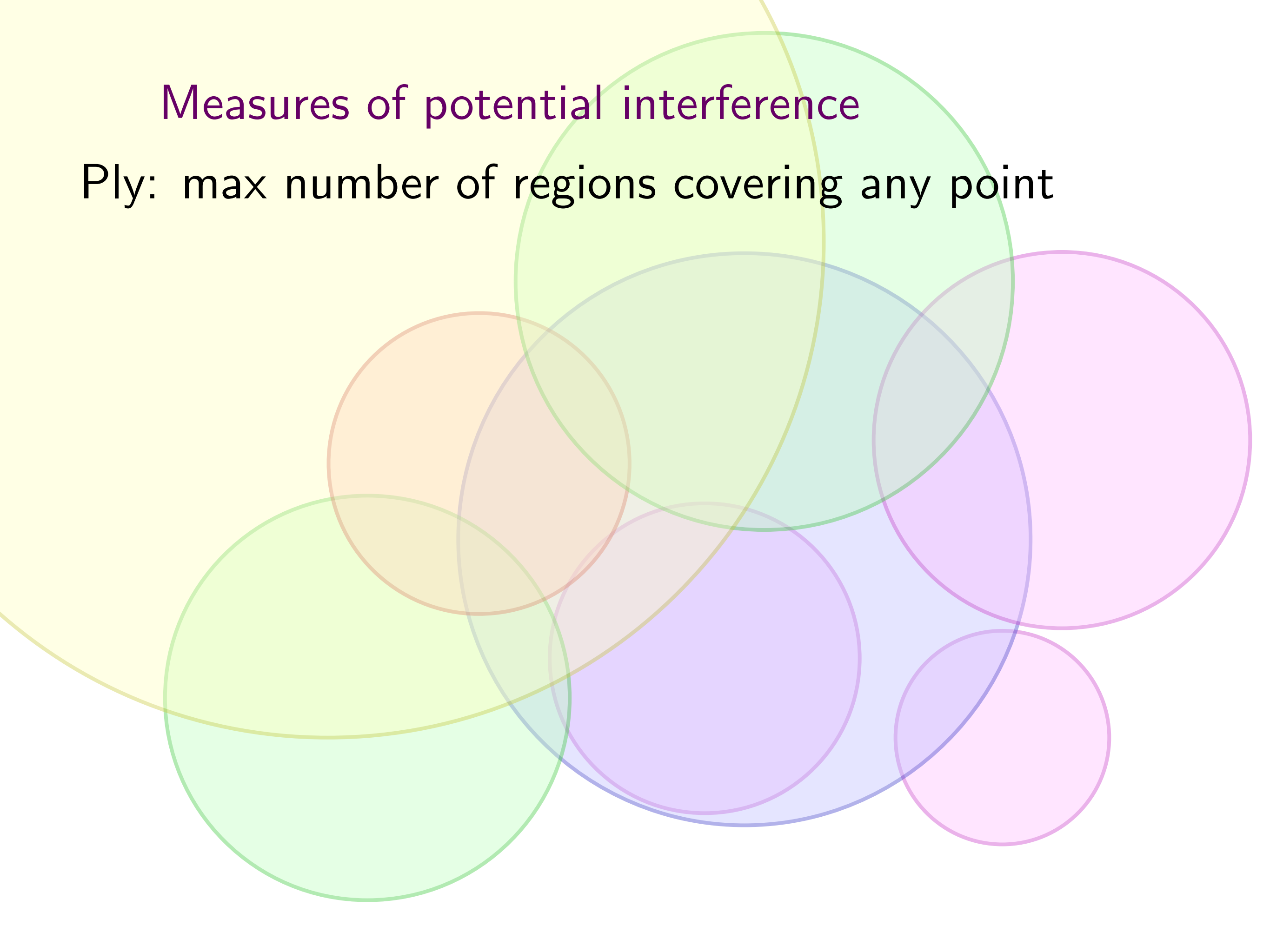
Kirkpatrick '09 (hyperbolic dovetailing)

Measures of potential interference



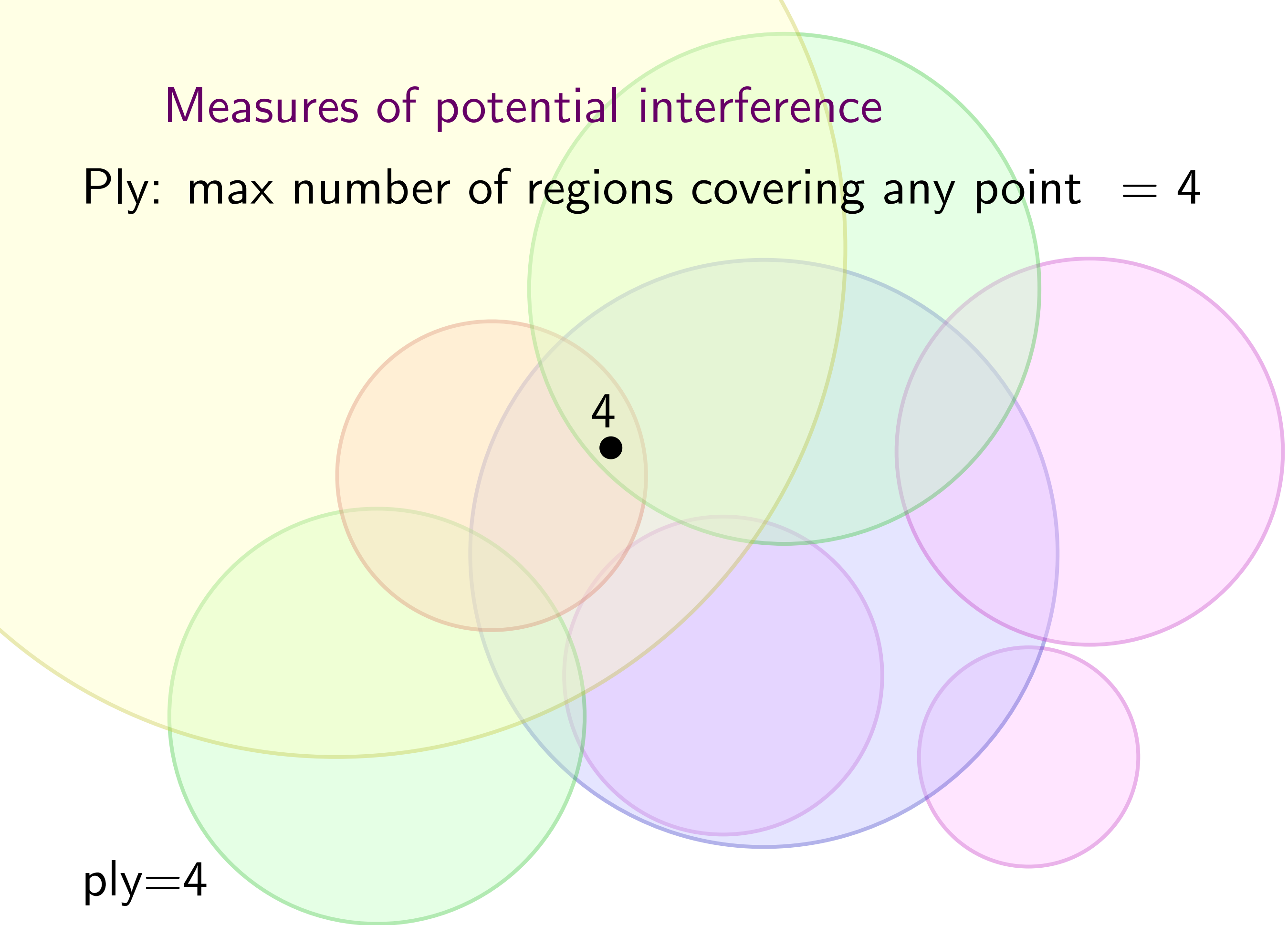
Measures of potential interference

Ply: max number of regions covering any point



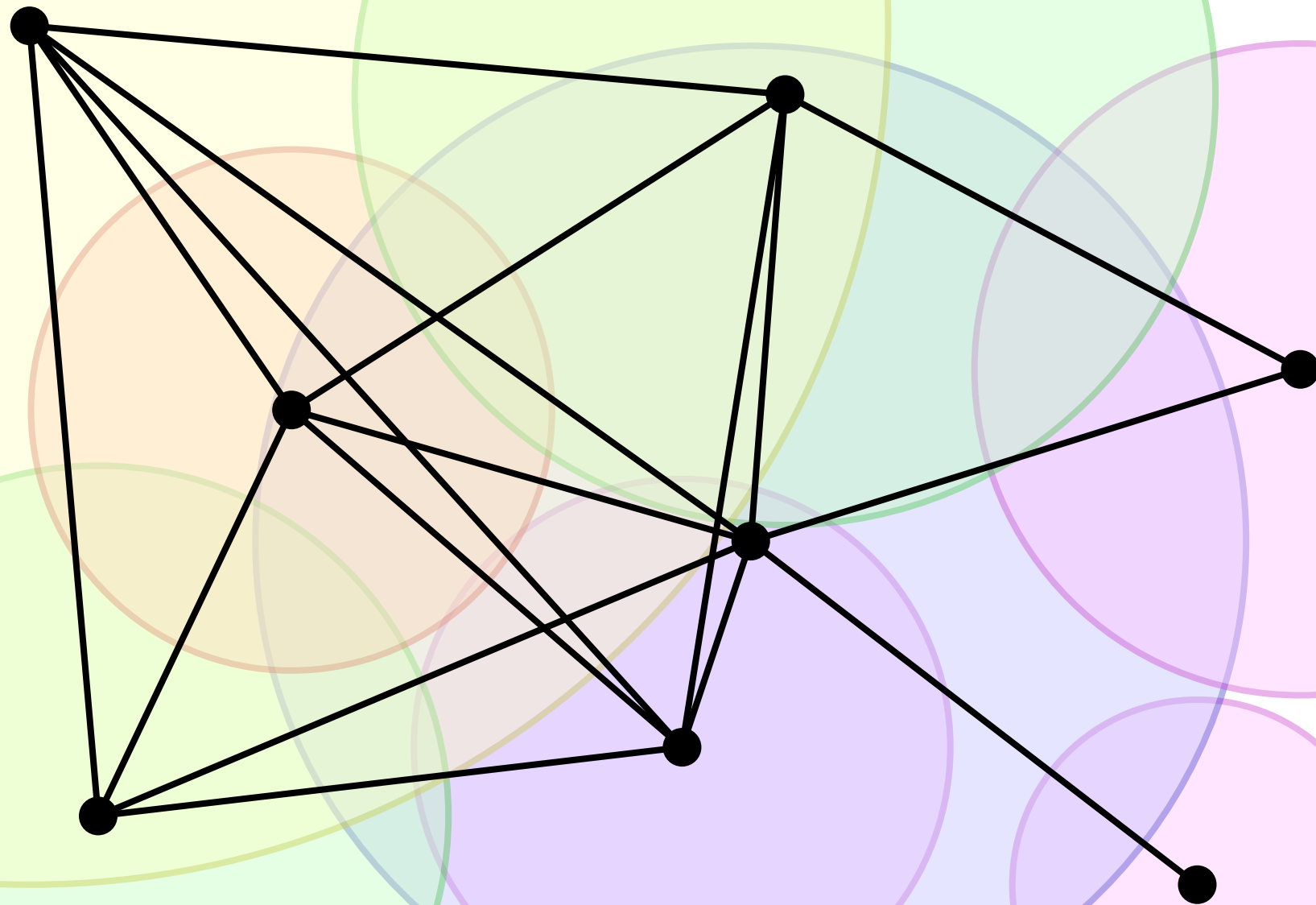
Measures of potential interference

Ply: max number of regions covering any point = 4



Measures of potential interference

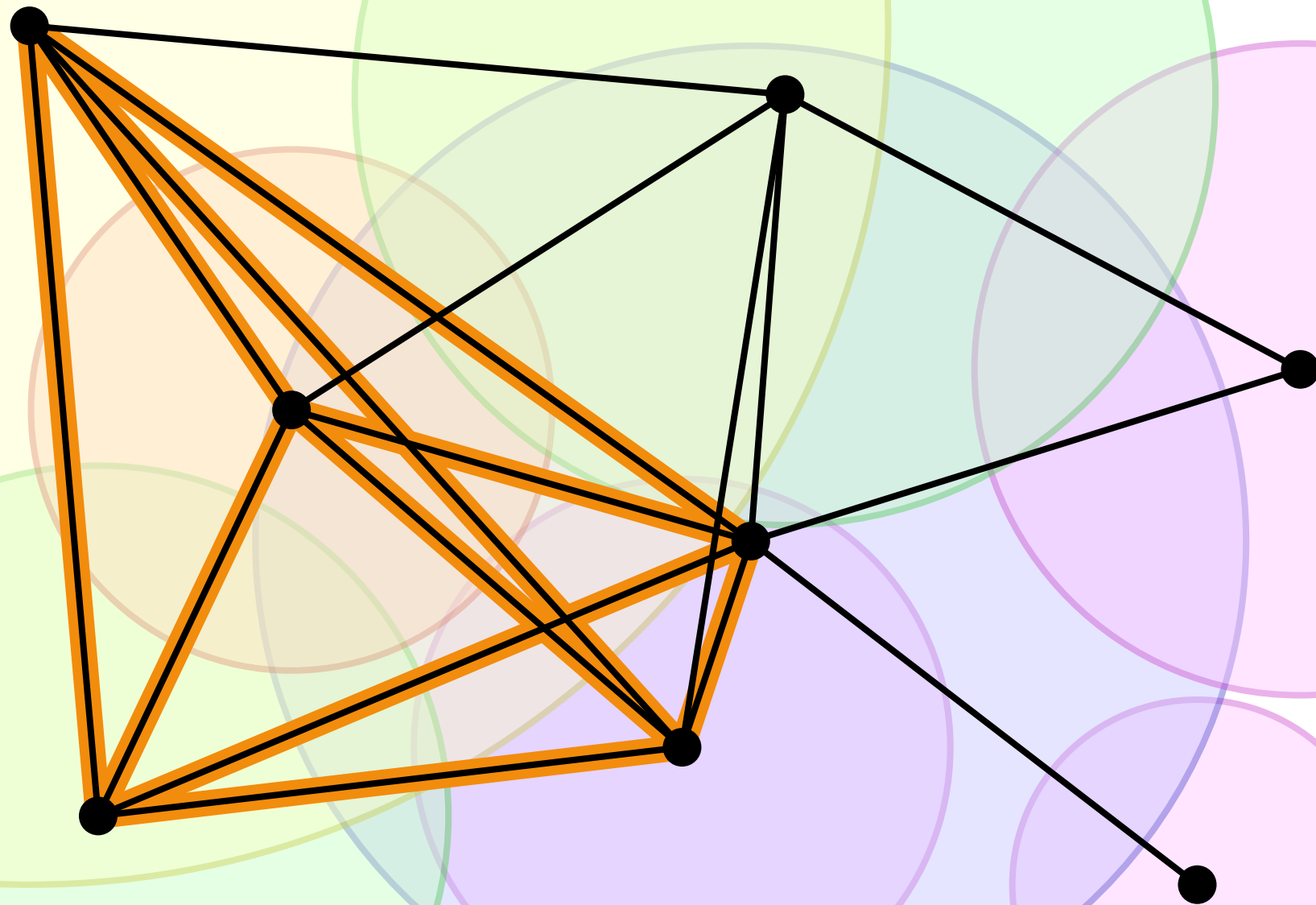
Clique number of intersection graph



ply=4

Measures of potential interference

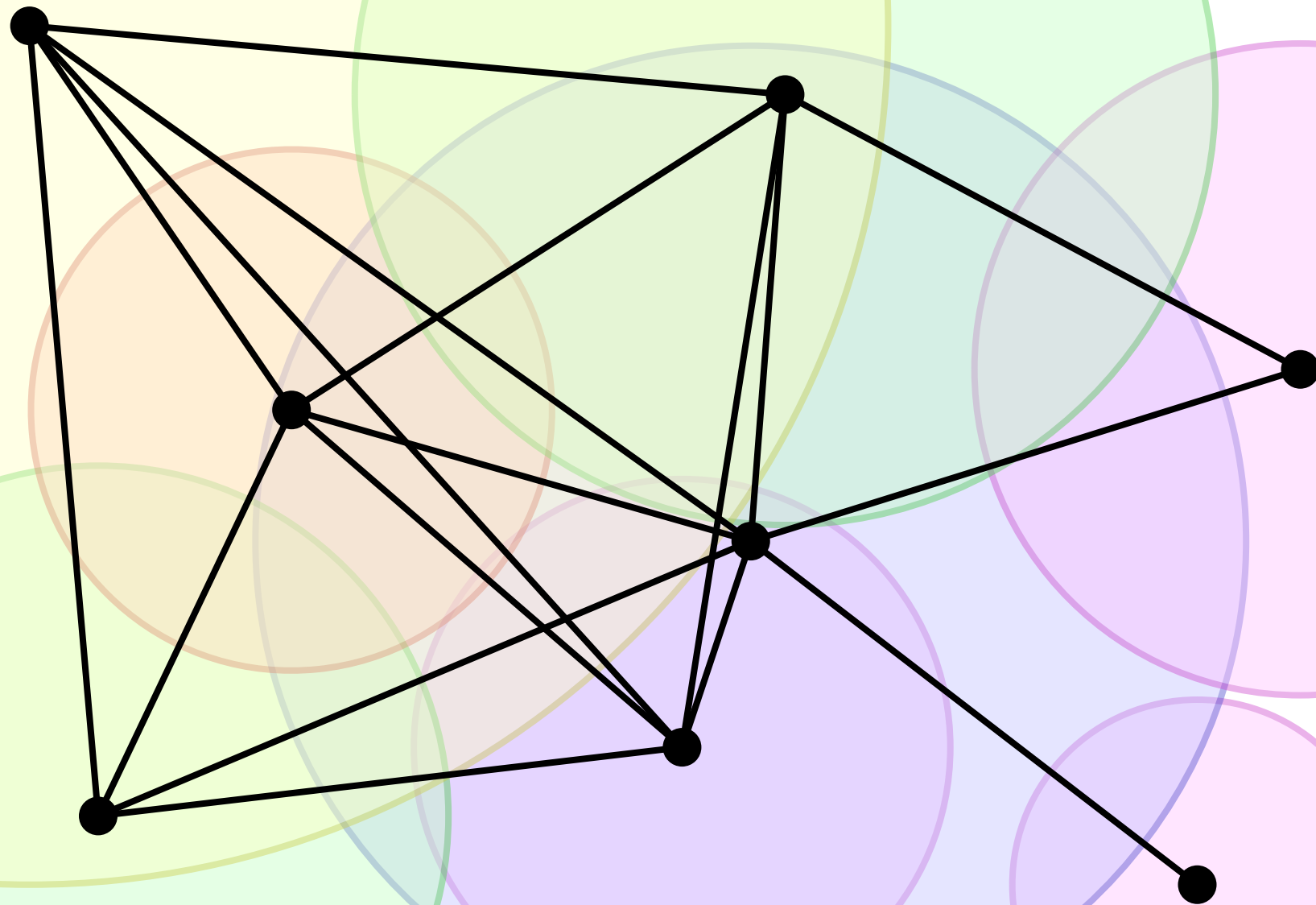
Clique number of intersection graph = 5



$$\text{ply}=4 \leq \text{clique}=5$$

Measures of potential interference

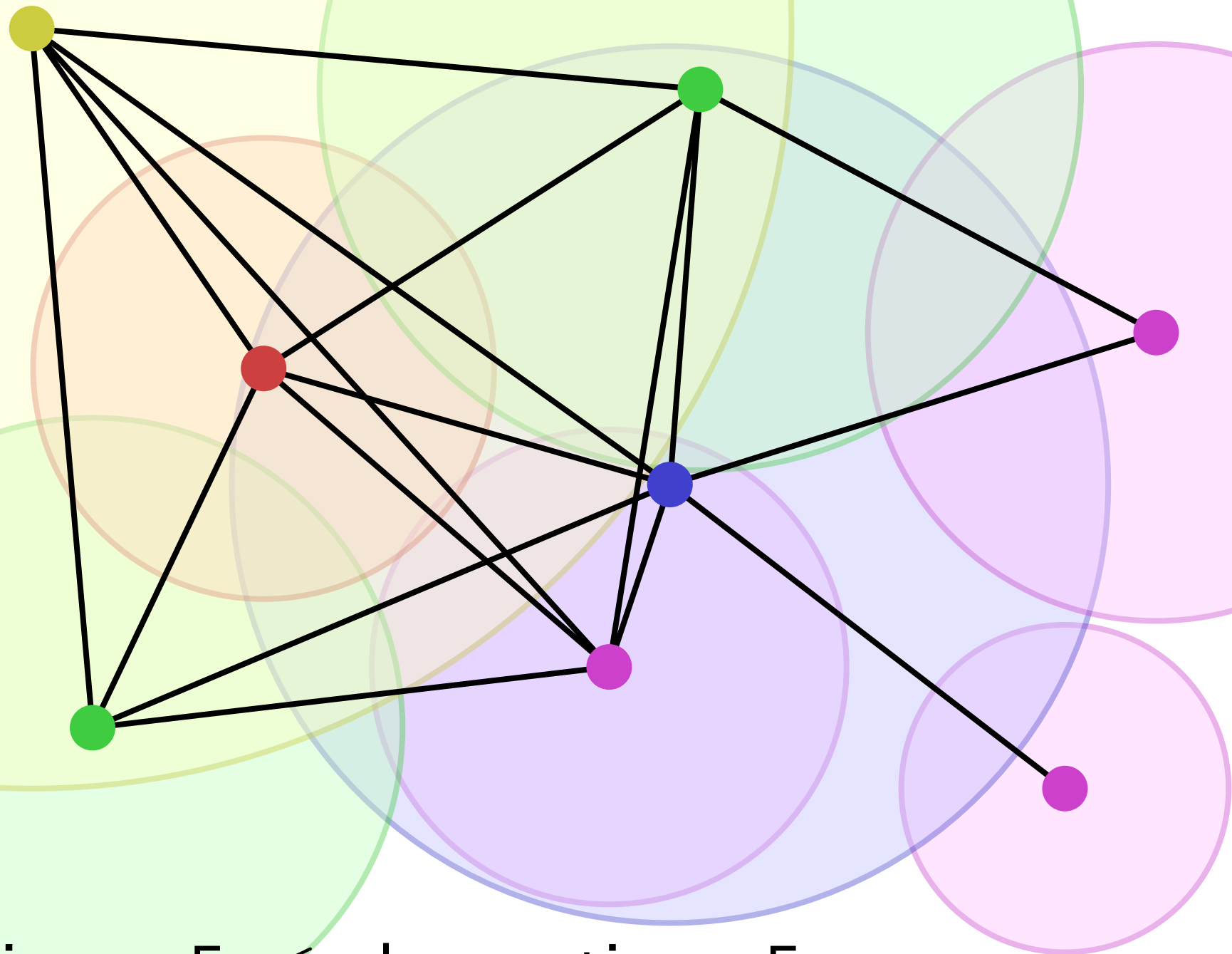
Chromatic number of intersection graph



$$\text{ply}=4 \leq \text{clique}=5$$

Measures of potential interference

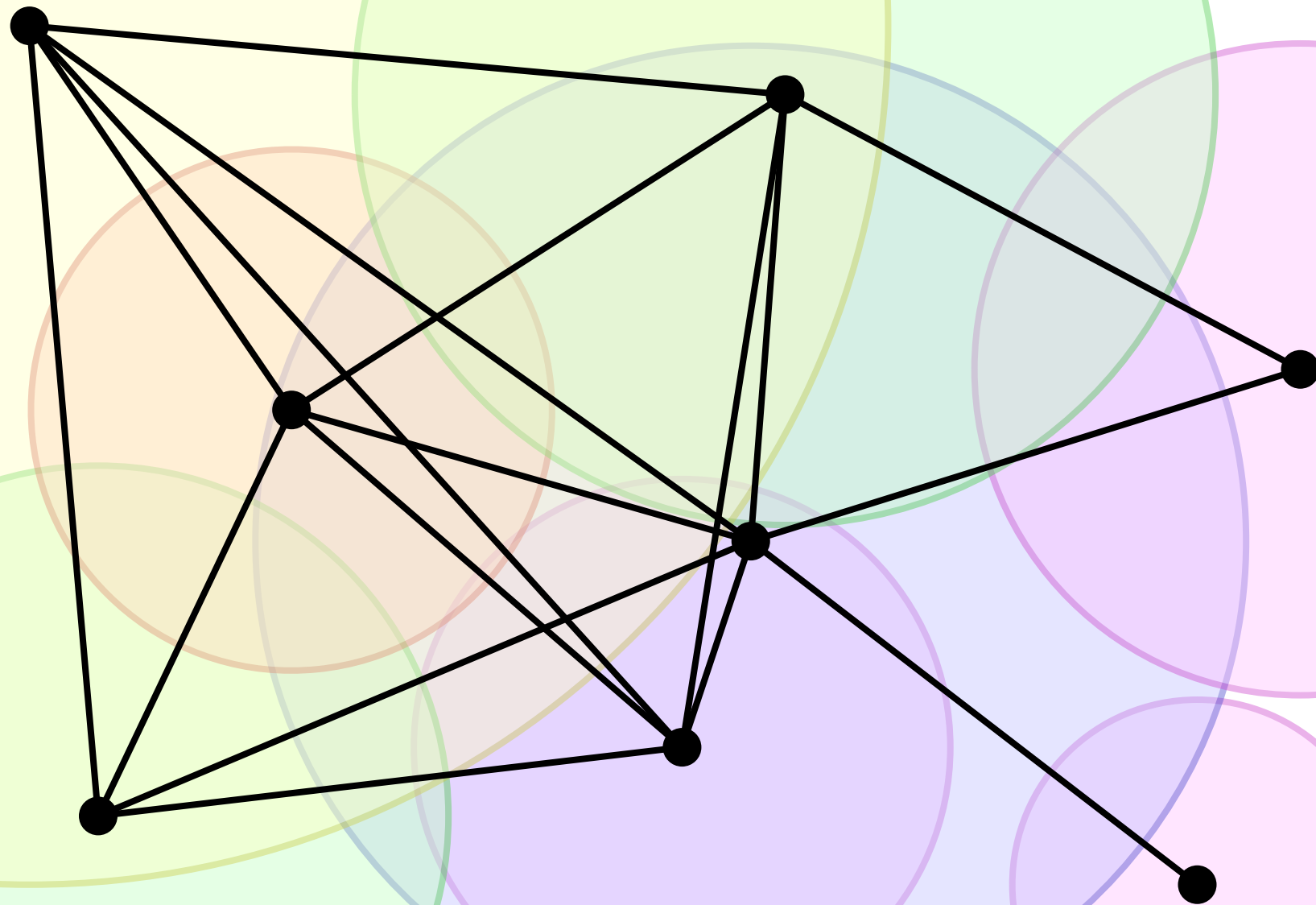
Chromatic number of intersection graph = 5



$$\text{ply}=4 \leq \text{clique}=5 \leq \text{chromatic} = 5$$

Measures of potential interference

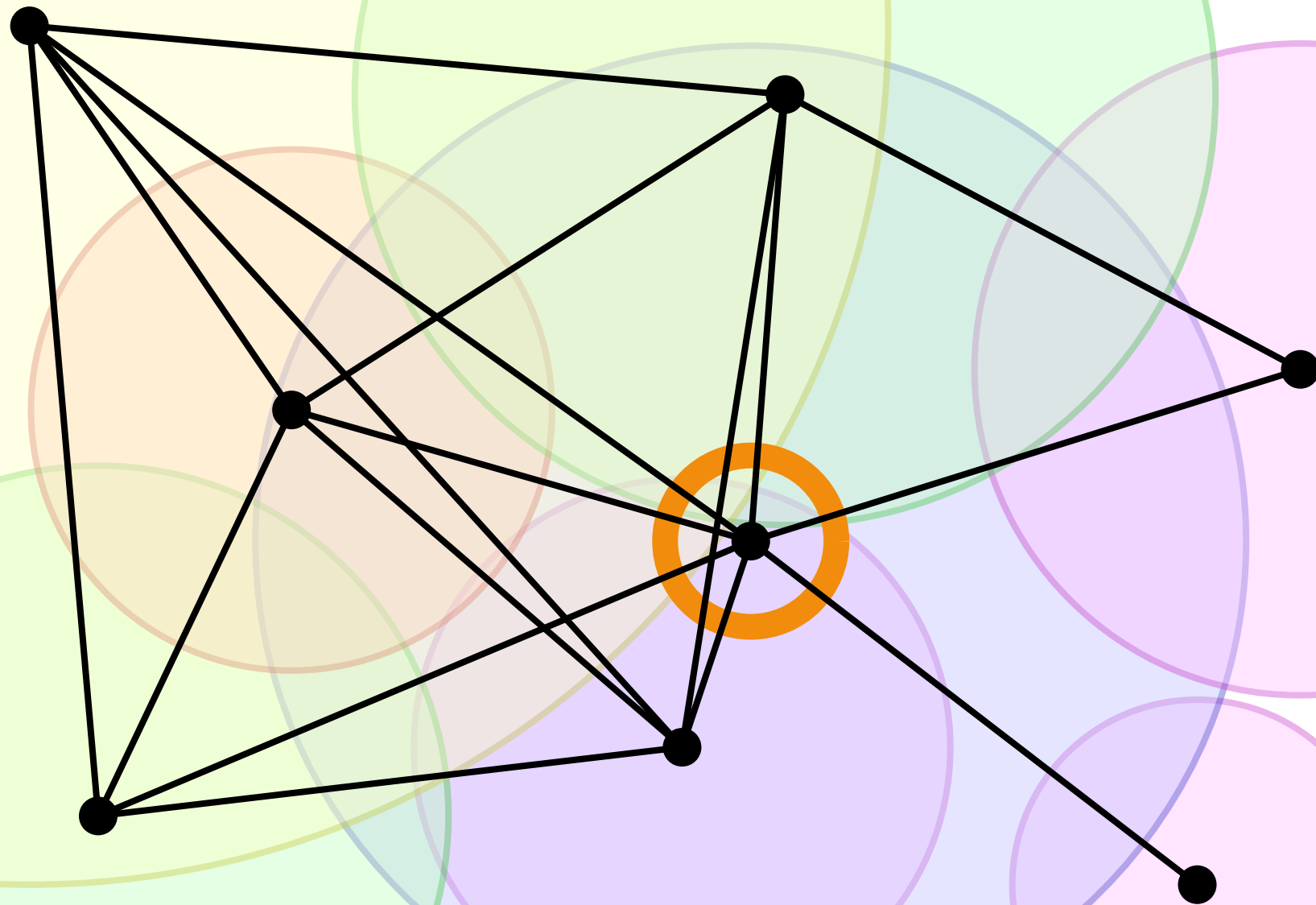
Max degree of intersection graph



$$\text{ply}=4 \leq \text{clique}=5 \leq \text{chromatic} = 5$$

Measures of potential interference

Max degree of intersection graph = 7



$$\text{ply}=4 \leq \text{clique}=5 \leq \text{chromatic} = 5 \leq \text{degree} + 1 = 8$$

Our main result

Theorem. *For n entities, the Adaptive Bucket Strategy keeps **degree** $O(x^*)$ during any time interval $T = [a, b]$ where x^* is the maximum **ply** observed by the best strategy over the interval $[a - |T|, b]$, provided $|T| > c_d n$.*

Query to reduce interference potential

at a target time [E,K,Löffler,Staals '16]

A
●

B
●

C
●

D
●

E
●

F
●

G
●

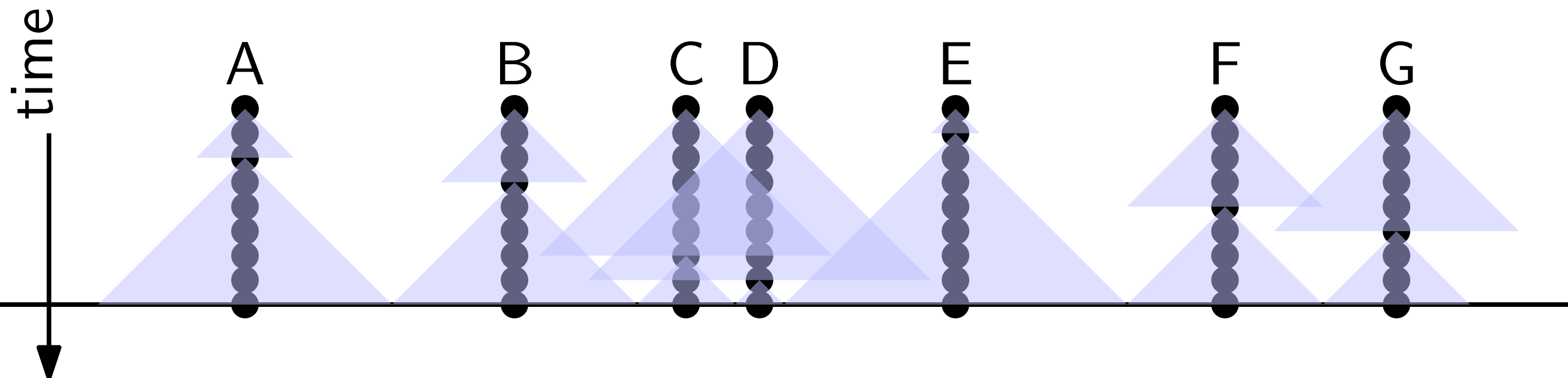
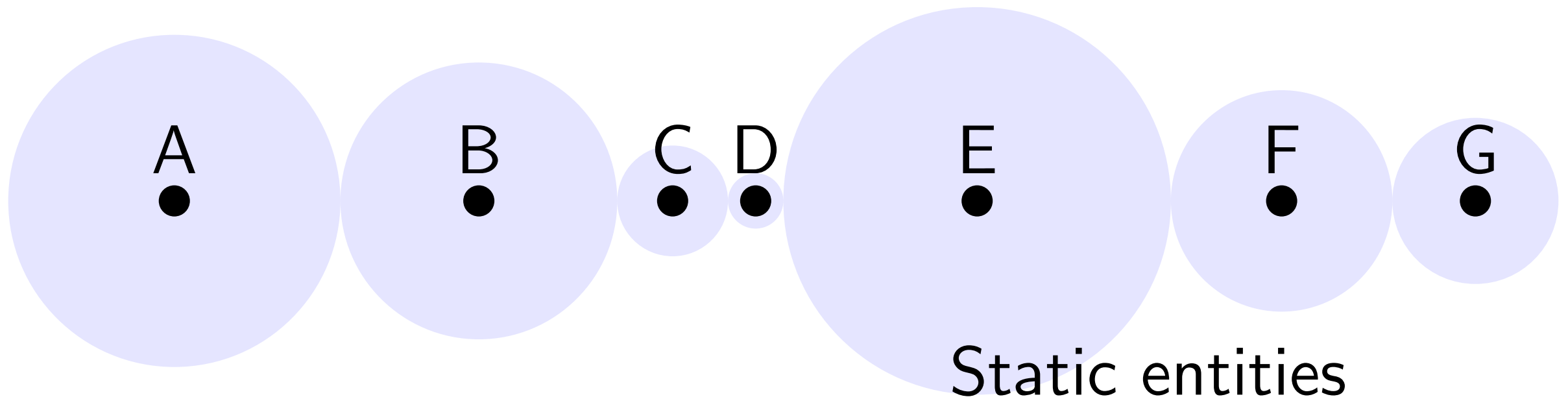
Static entities

Query to reduce interference potential

at a target time [E,K,Löffler,Staals '16]

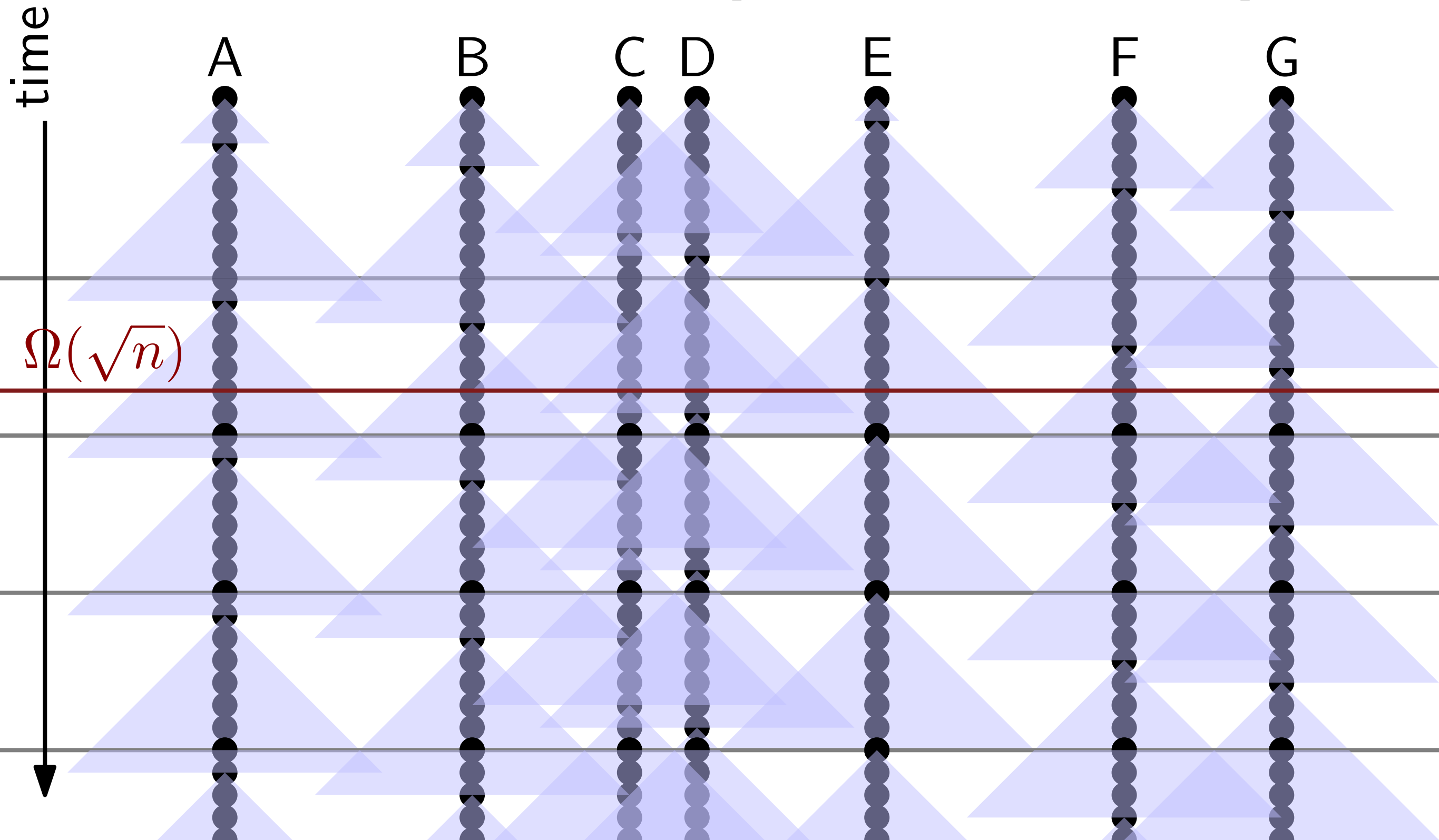
Optimal: Query EABFGCD

NP-complete even
for static entities



Query to reduce interference potential

Repeat at a target time [E,K,Löffler,Staals '16]



Query to reduce interference potential
at **all** times [this paper]

Let's start with static point entities e_1, \dots, e_n .

e_1
●

e_2
●

e_3
●

e_4
●

e_5
●

e_6
●

e_7
●

Query to reduce interference potential
at **all** times [this paper]

Let's start with static point entities e_1, \dots, e_n .

	e_1	e_2	e_3	e_4	e_5	e_6	e_7
	●	●	●	●	●	●	●
$r_i(1)$	11	7	3	3	8	7	7

x -radius $r_i(x) =$ distance from e_i to its x^{th} -nearest entity

To keep **degree** $< x$, must query e_i every $r_i(x)$ steps.

If $\sum_{i=1}^n \frac{1}{r_i(x)} > 1$ this is impossible.

x -density

Observation

Unavoidable interference

The **congestion** of a set \mathcal{E} of entities is

$$x_{\mathcal{E}} = \max\{x \mid \sum_{e_i \in \mathcal{E}} \frac{1}{r_i(x)} > 1\}.$$

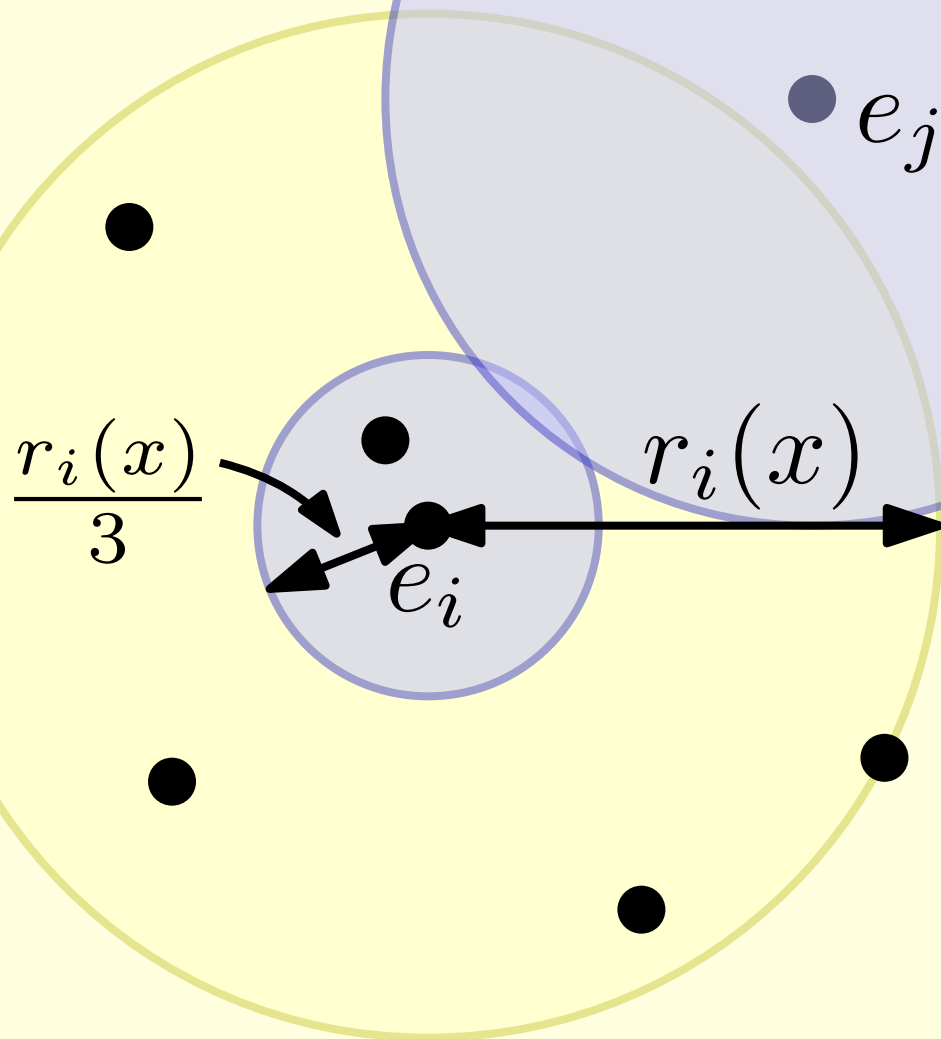
Theorem. *Any query strategy for n static entities \mathcal{E} suffers **ply** $\Omega(x_{\mathcal{E}})$ at some time in any n consecutive time steps.*

Algorithm to avoid interference

Weighted Round Robin

Idea: Query entity e_i so its uncertainty region has radius $< r_i(k(x_{\mathcal{E}} + 1))/3$.

Let $x = k(x_{\mathcal{E}} + 1)$



If e_j 's region intersects e_i 's then e_j is nbr_x of e_i .

\Rightarrow **max degree** $\leq x$

Algorithm to avoid interference

Theorem. *Any query strategy for n static entities \mathcal{E} suffers **ply** $\Omega(x_{\mathcal{E}})$ at some time in any n consecutive time steps.*

Theorem. *For static entities, Weighted Round Robin maintains **degree** $O(x_{\mathcal{E}})$ at all times.*

Algorithm to avoid interference

Theorem. *Any query strategy for n static entities \mathcal{E} suffers **ply** $\Omega(x_{\mathcal{E}})$ at some time in any n consecutive time steps.*

Theorem. *For static entities, Weighted Round Robin maintains **degree** $O(x_{\mathcal{E}})$ at all times.*

Theorem. *For n static point entities \mathcal{E} , if $\omega_{\mathcal{E}}$ is the minimum ply achievable at some target time, $x_{\mathcal{E}} \in O(\omega_{\mathcal{E}} \log^d(n/\omega_{\mathcal{E}}))$ and for some such \mathcal{E} this is tight.*

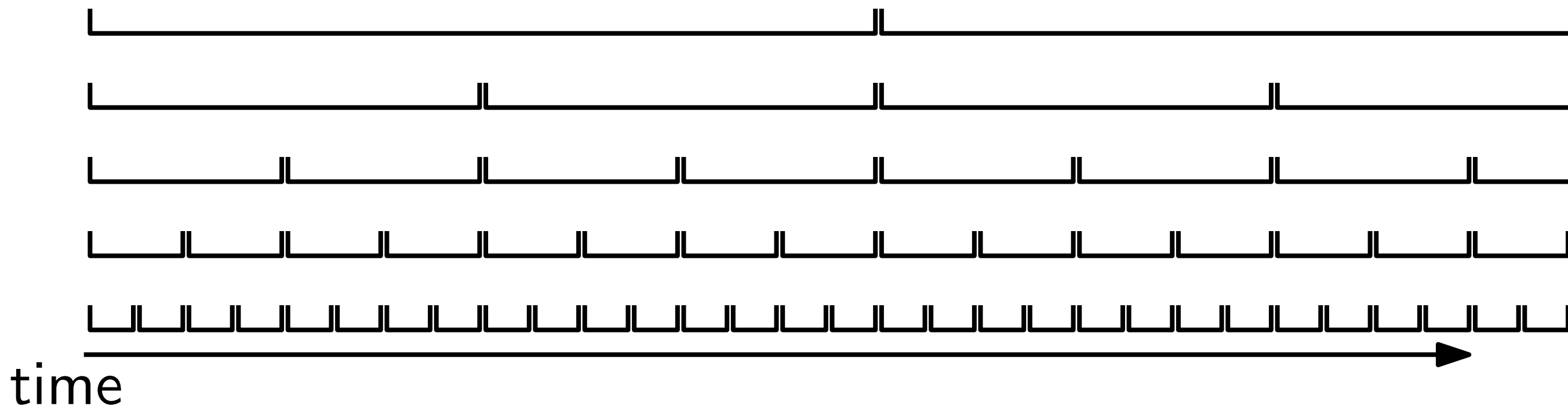
Dynamic entities

Complications due to movement:

1. Strategy knows **perceived** (last queried) location rather than true (current) location
2. Congestion x_ε varies over time

Bucket Strategy for fixed tolerance x

Idea: Schedule e_i for a future time interval (**bucket**) based on perceived x -radius $\tilde{r}_i(x, t)$ when queried.



Bucket Strategy for fixed tolerance x

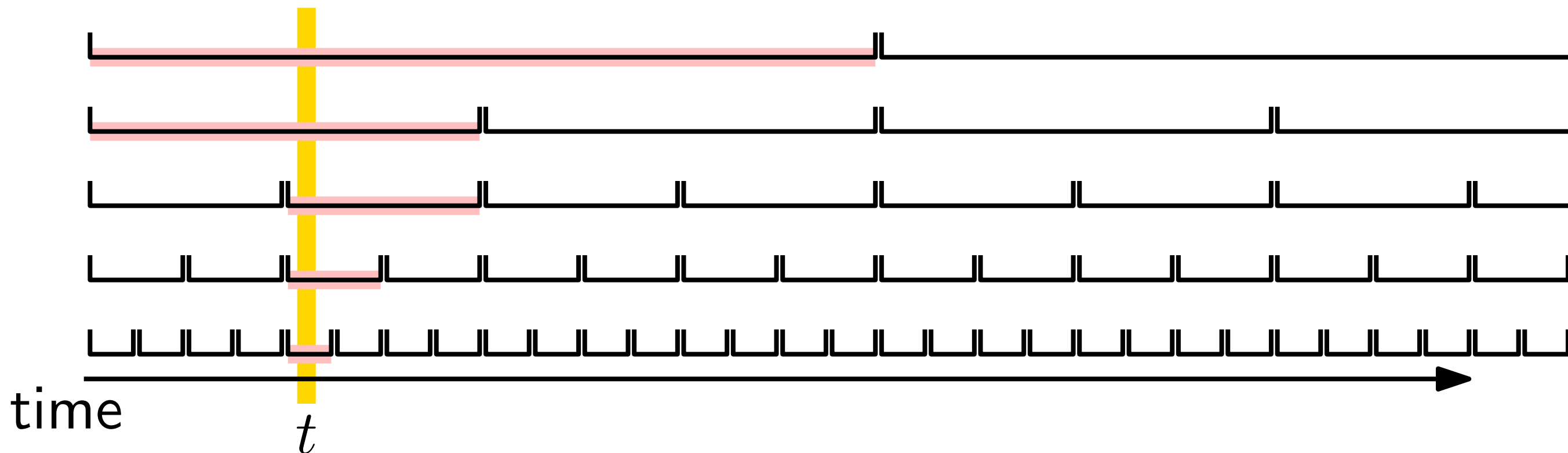
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Repeat for all time t

Query entity e_i from shortest active bucket

Move e_i to next bucket of length 2^b

where $b = \lfloor \lg(\tilde{r}_i(x, t)/Q) \rfloor$



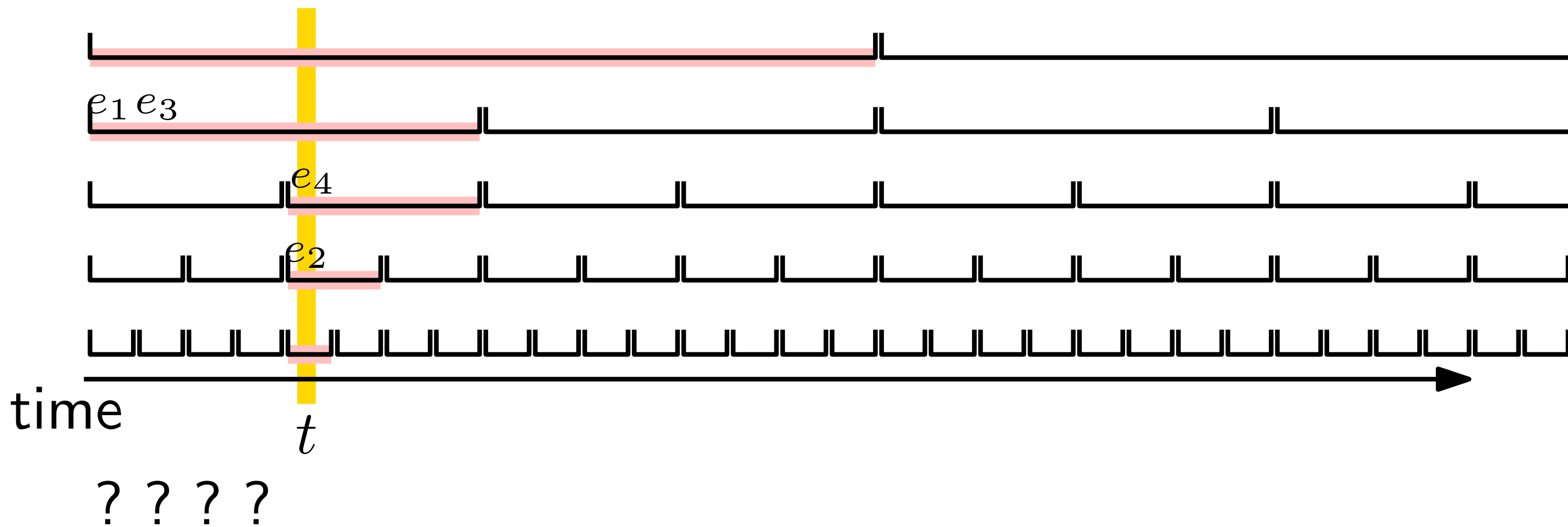
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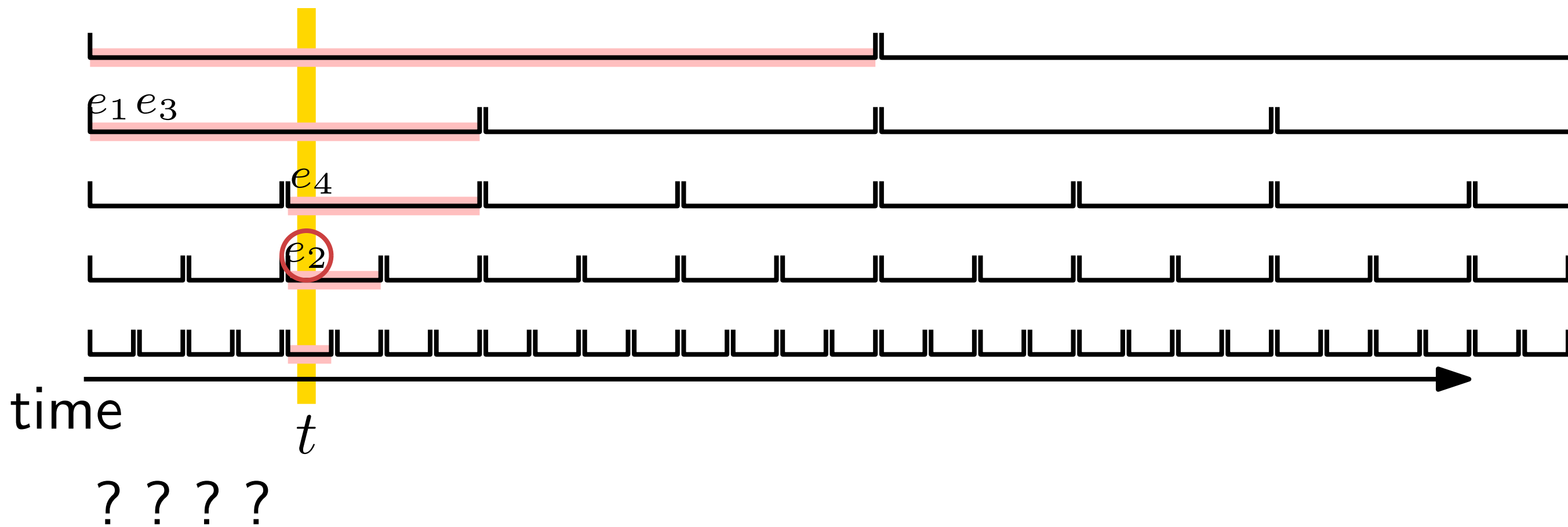
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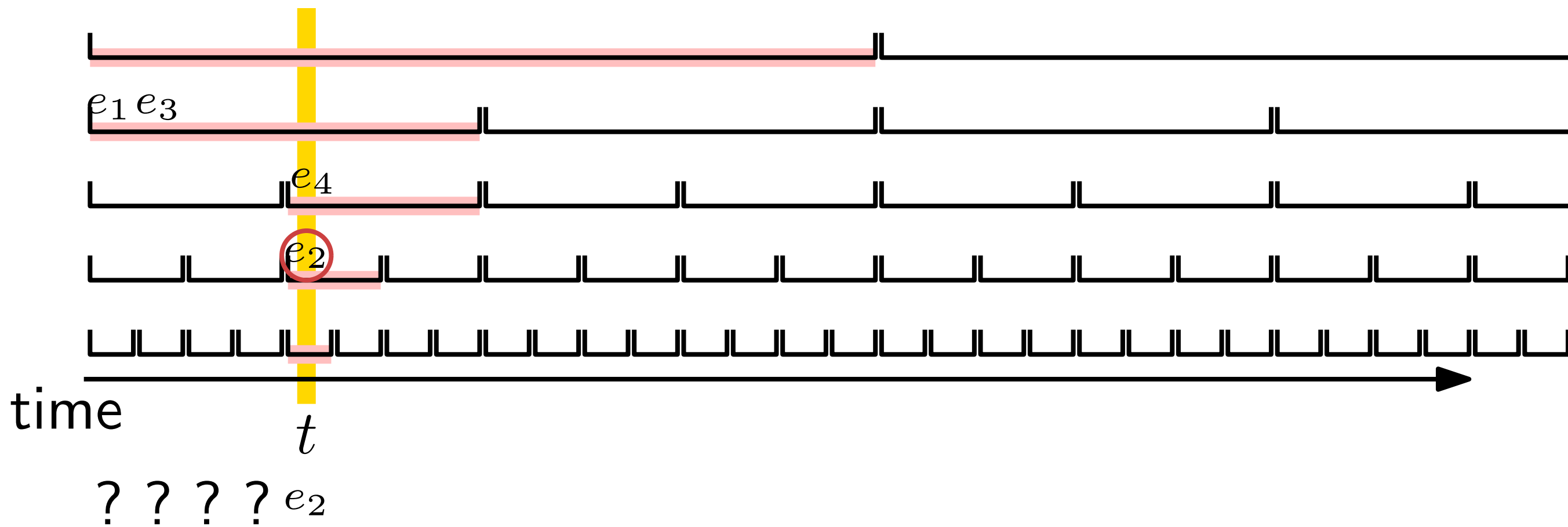
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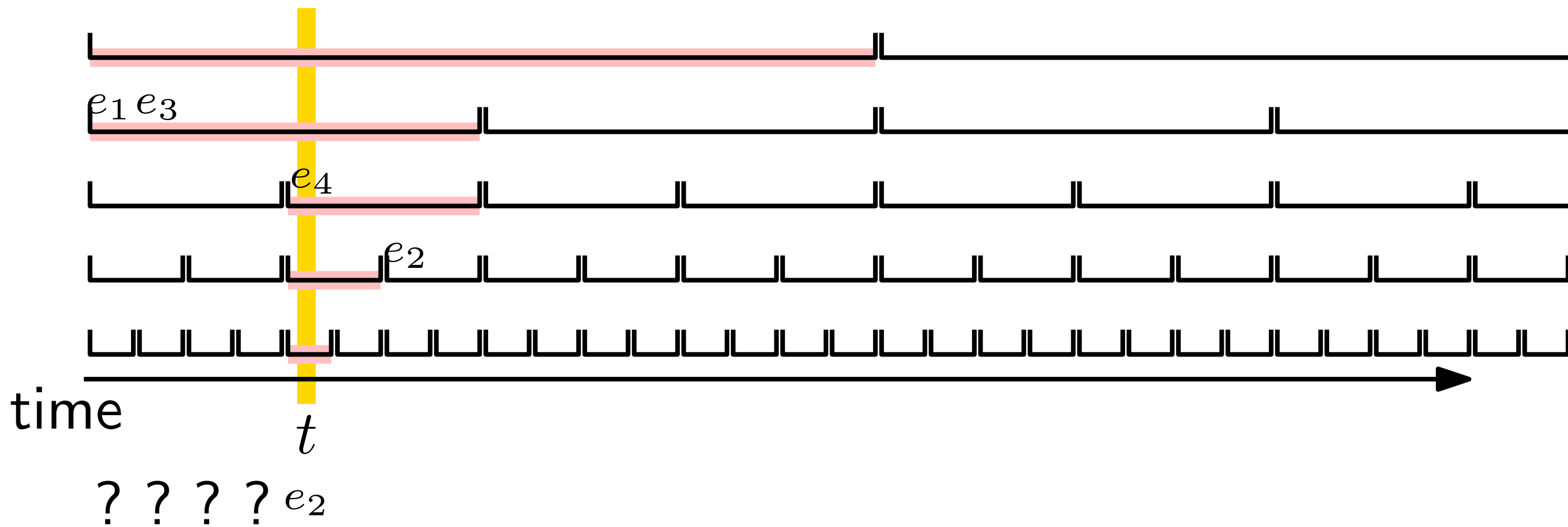
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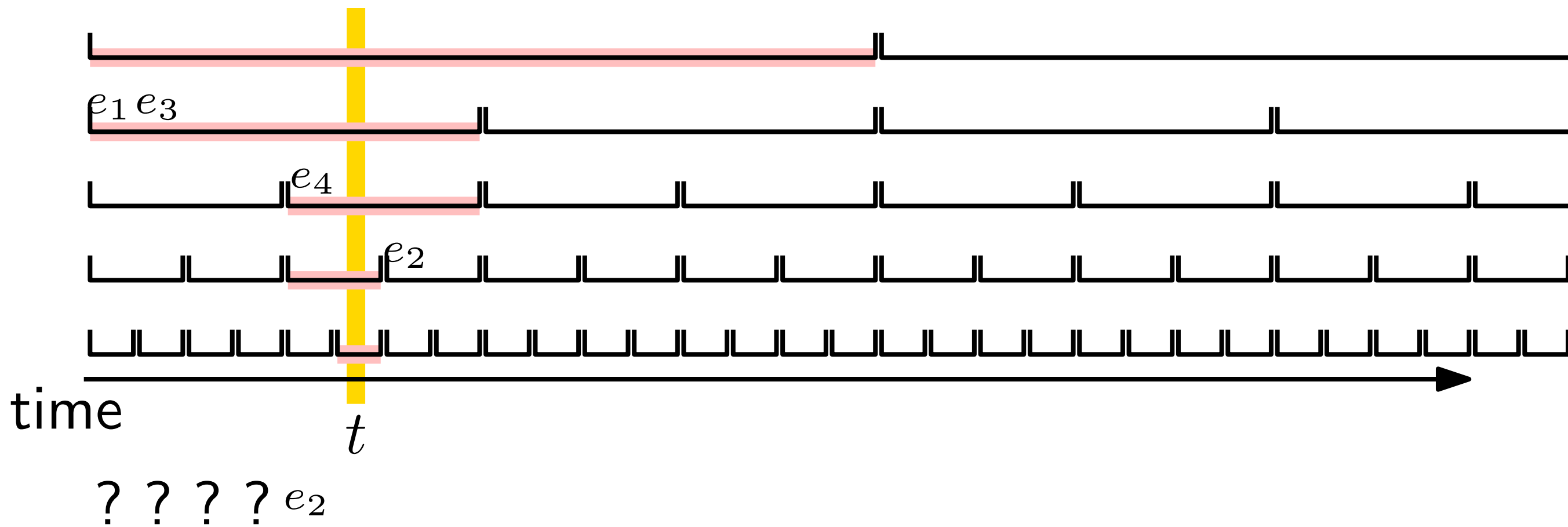
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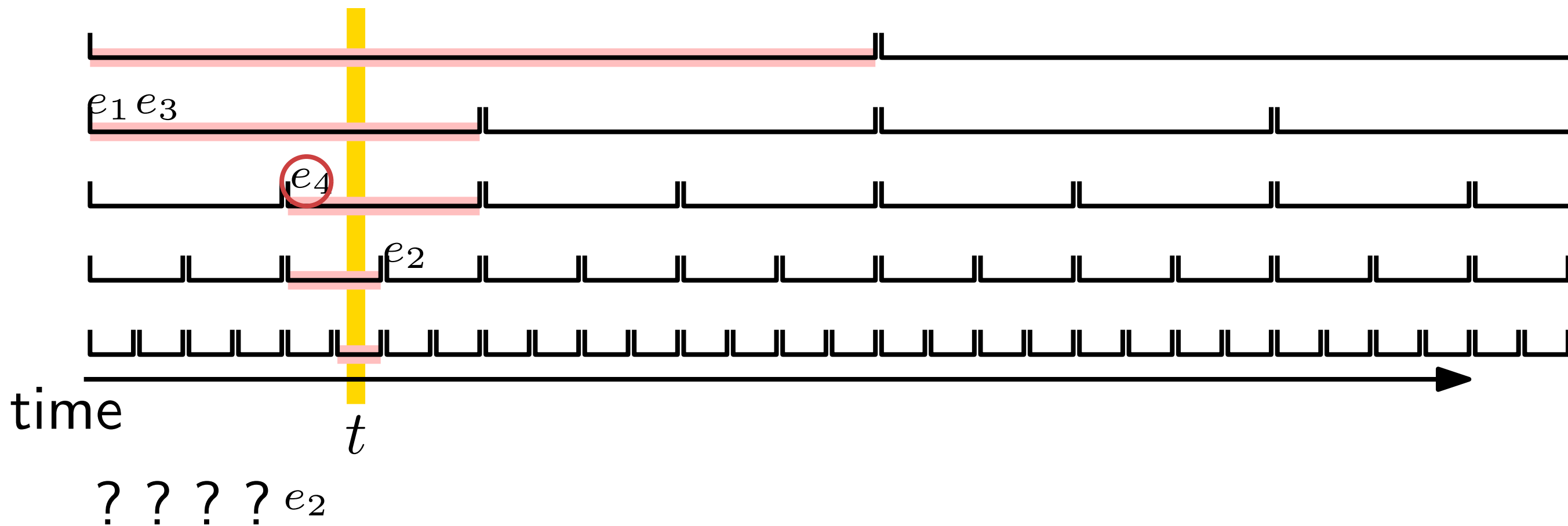
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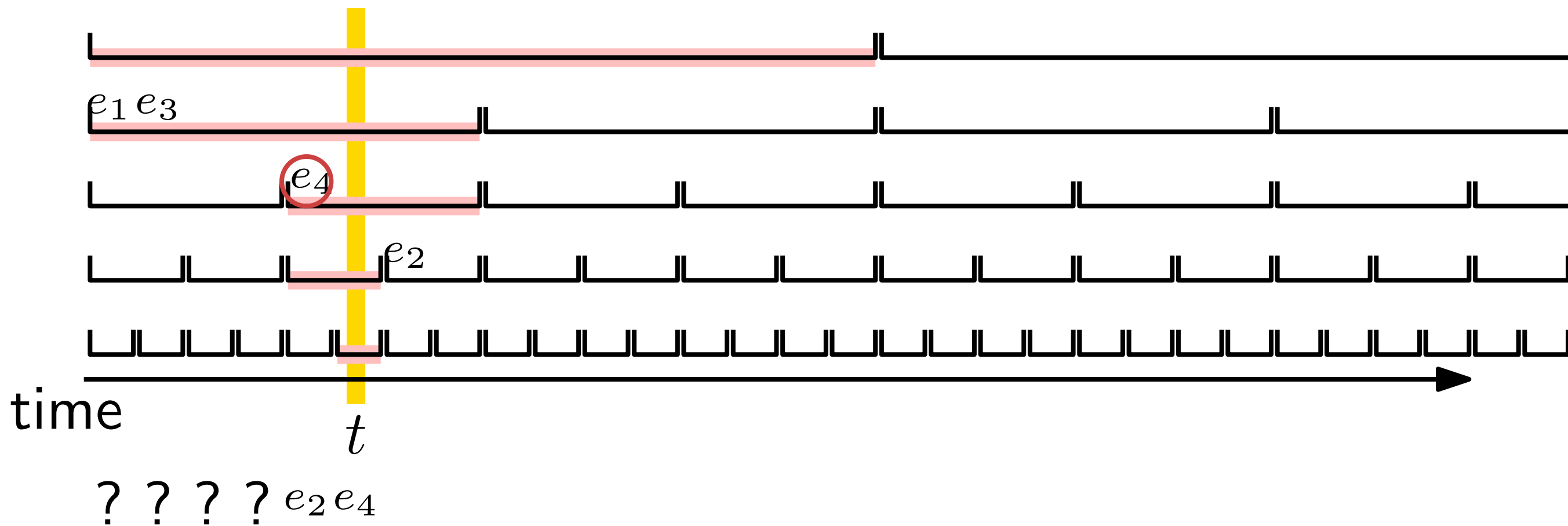
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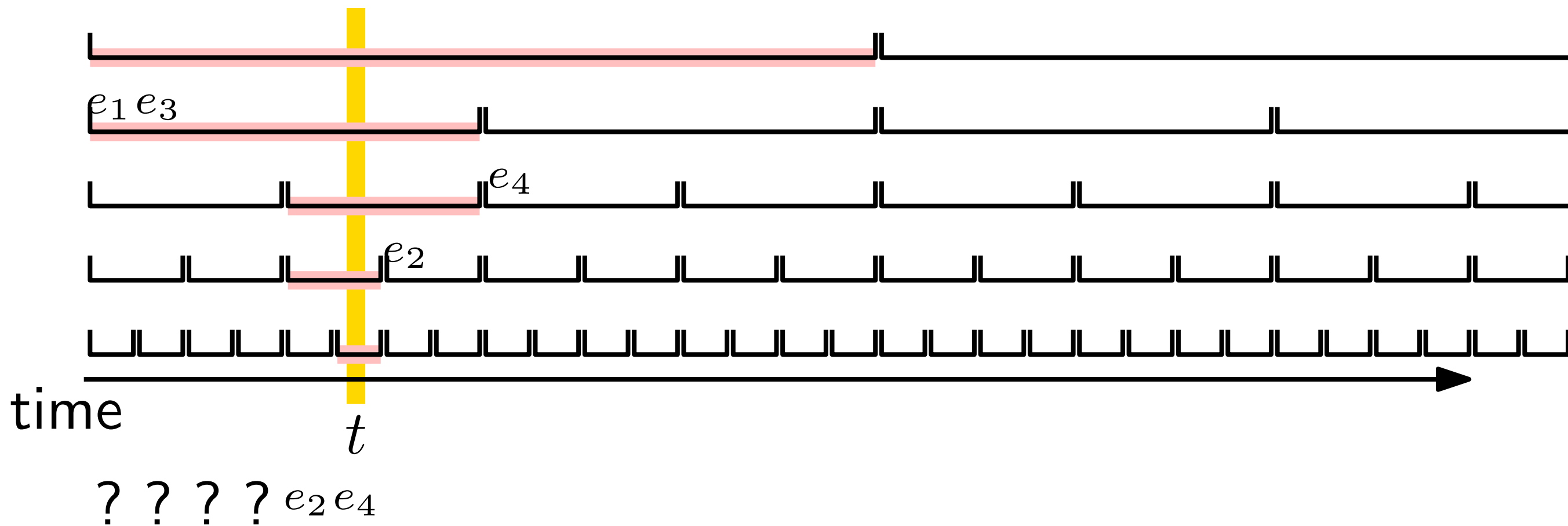
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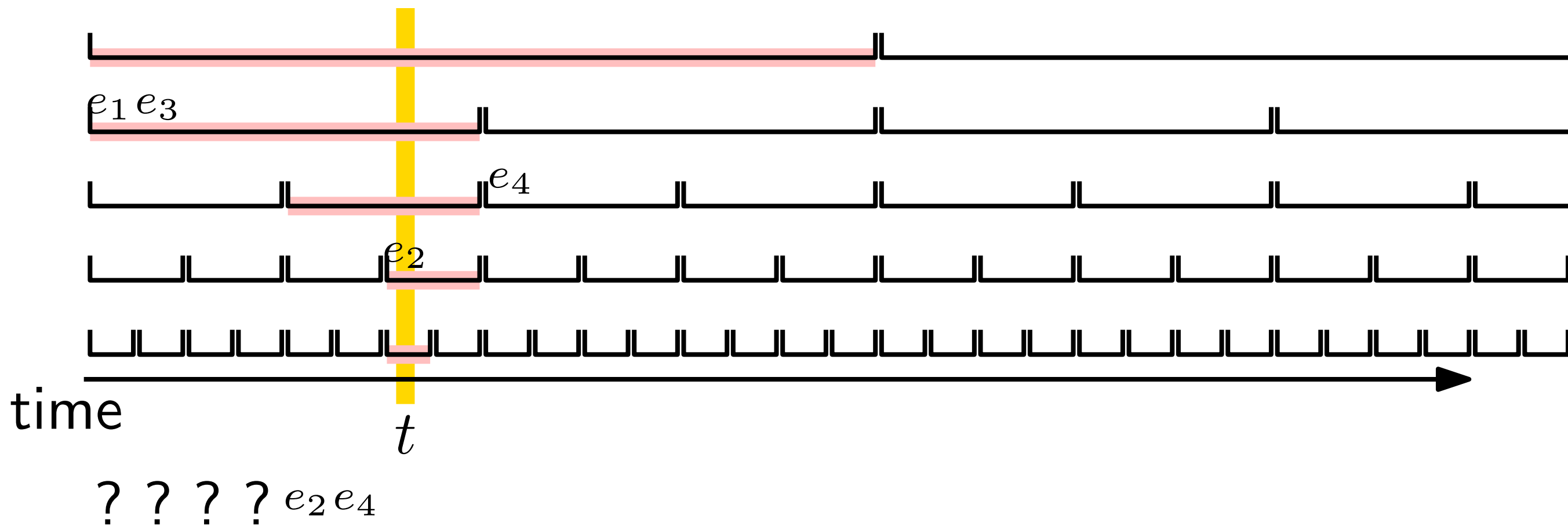
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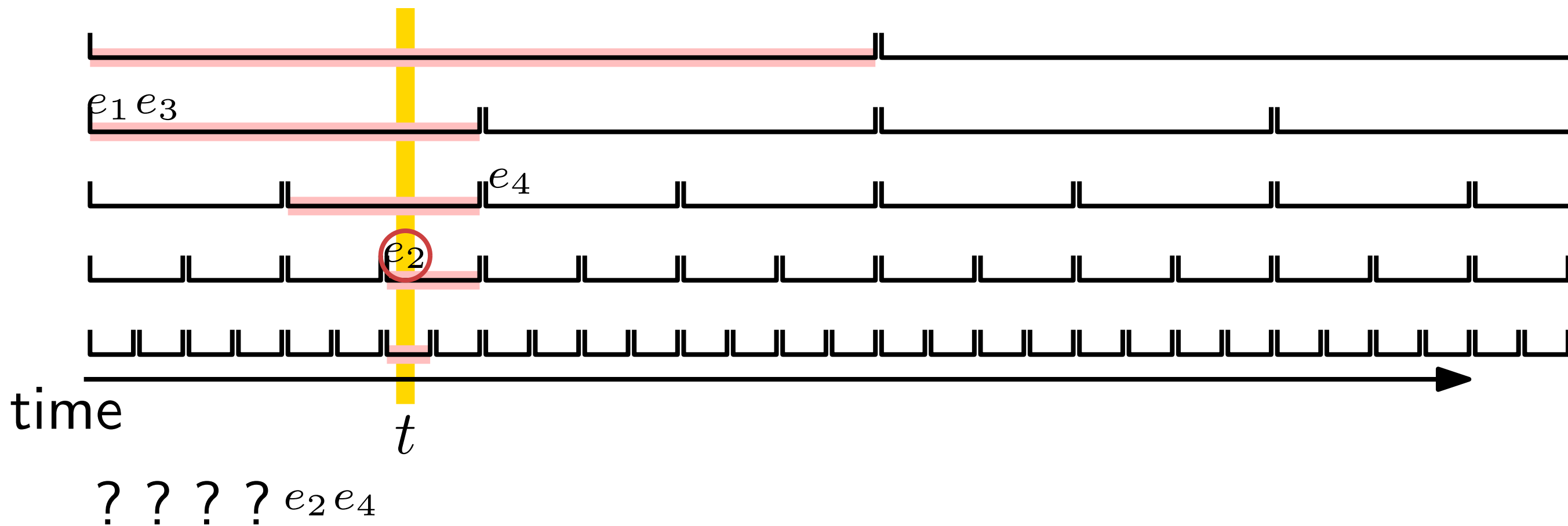
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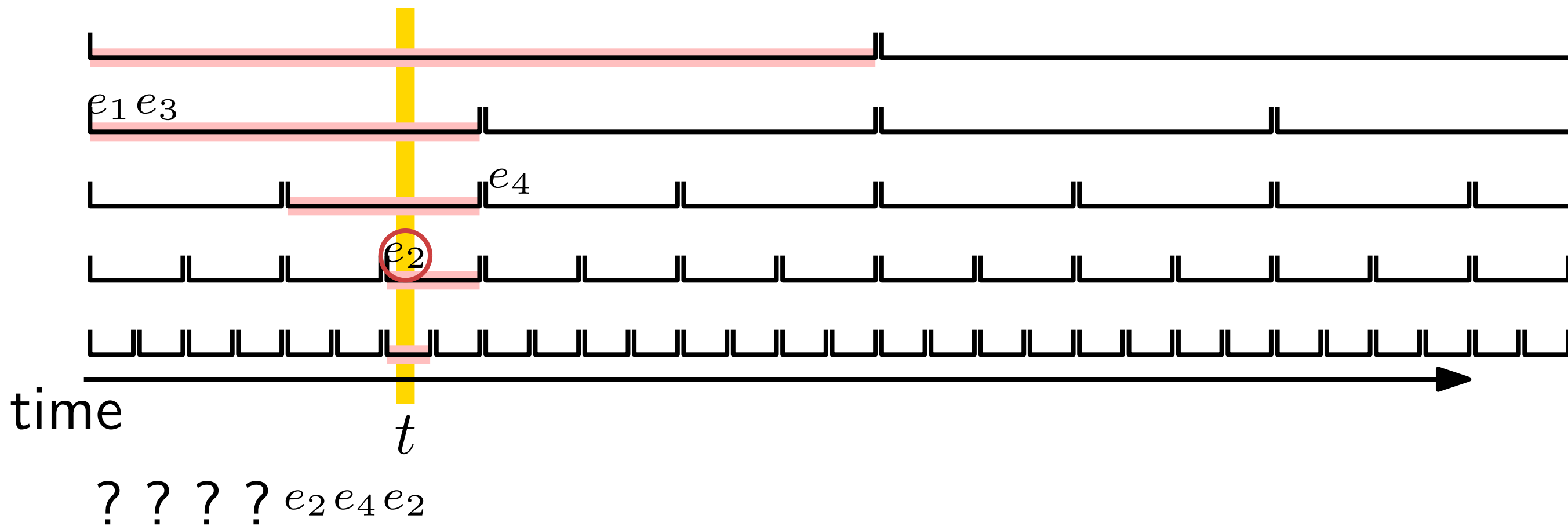
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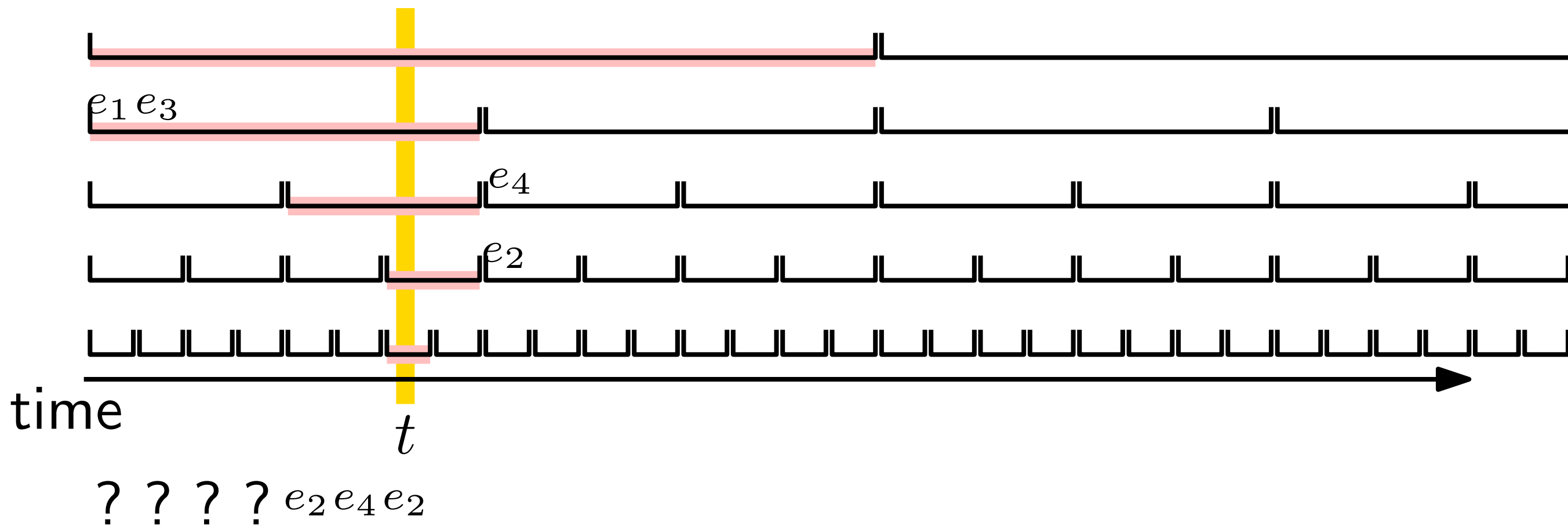
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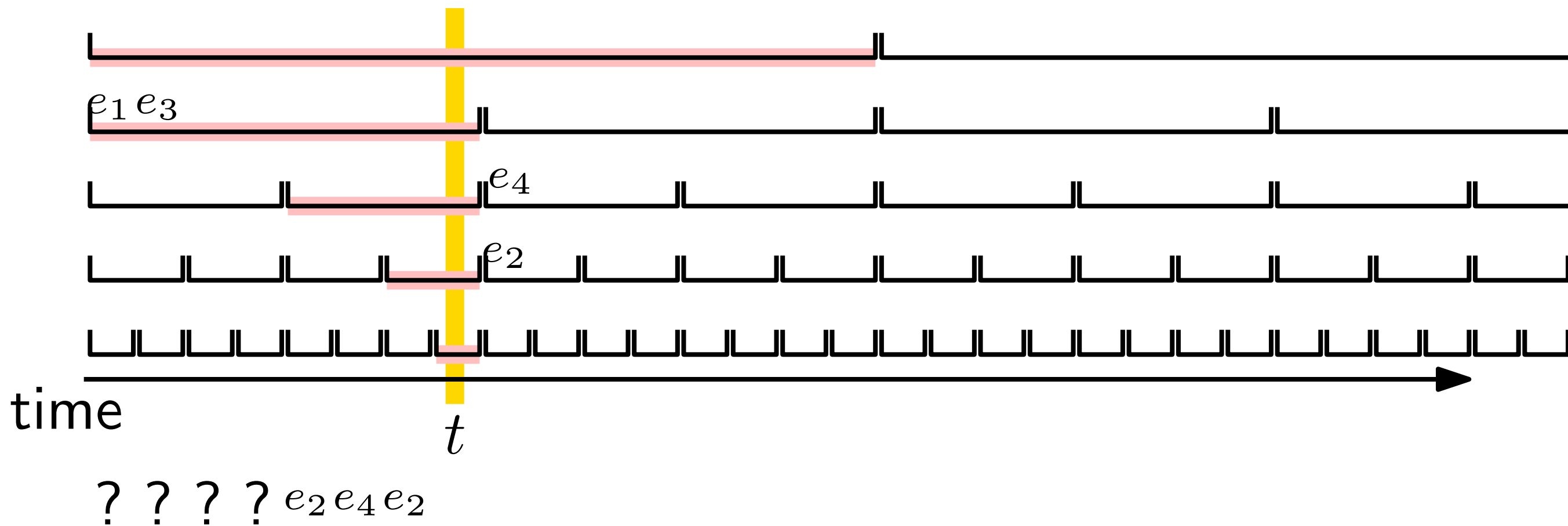
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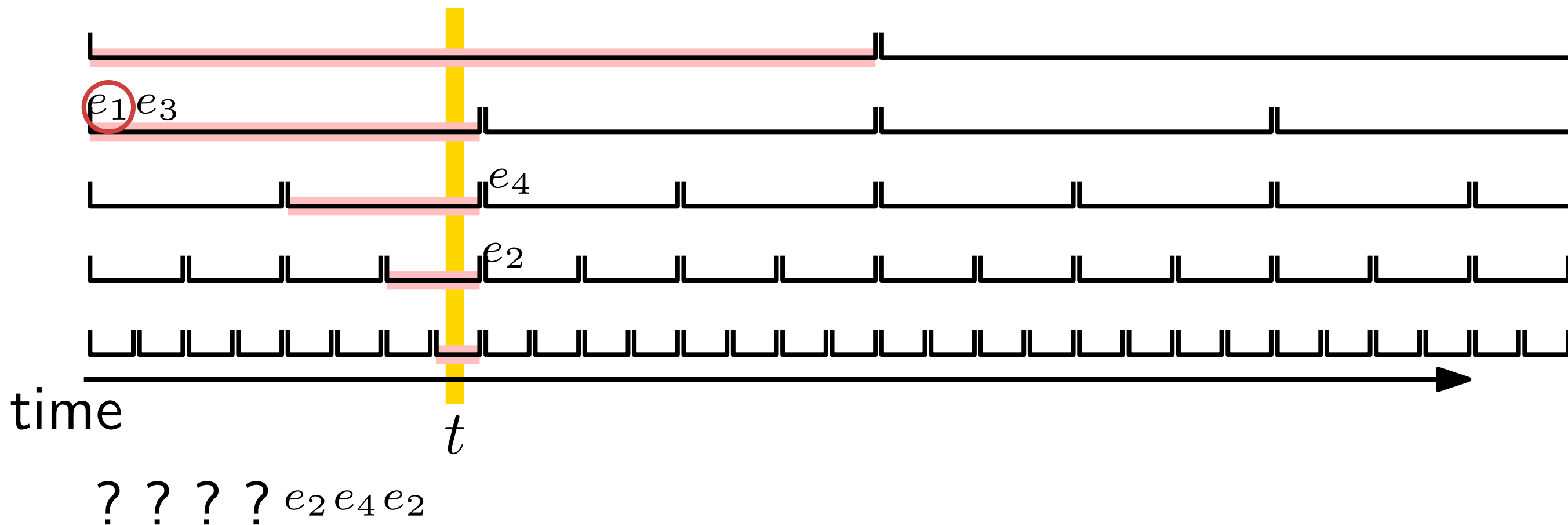
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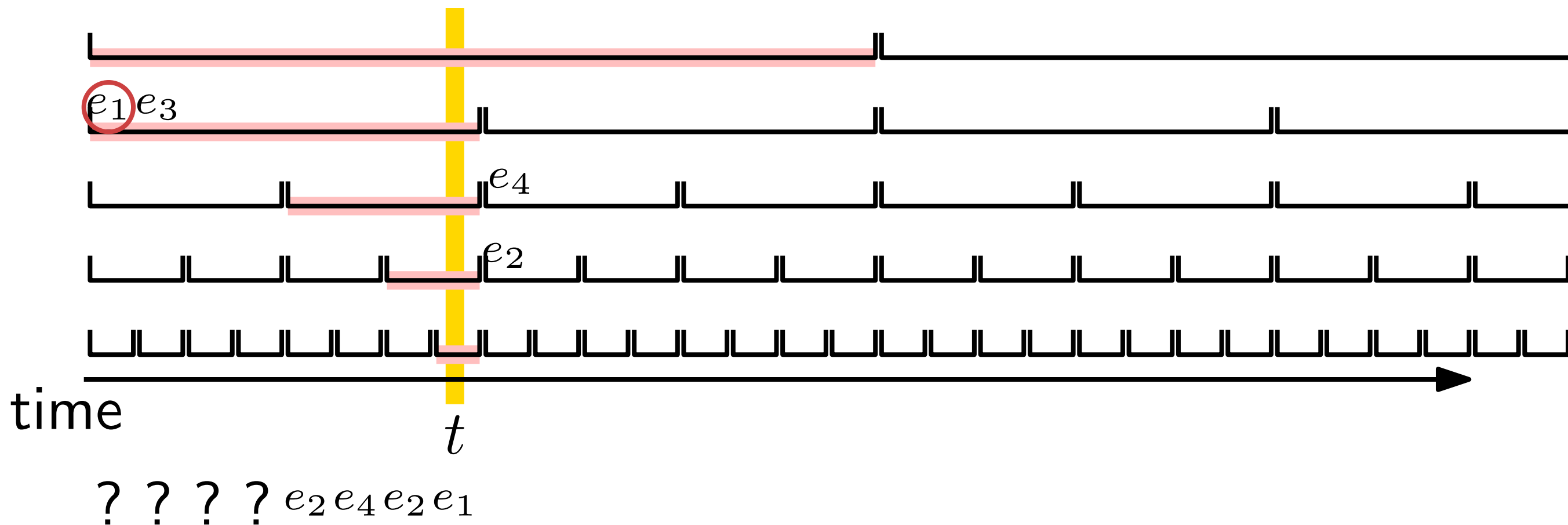
Bucket Strategy for fixed tolerance x

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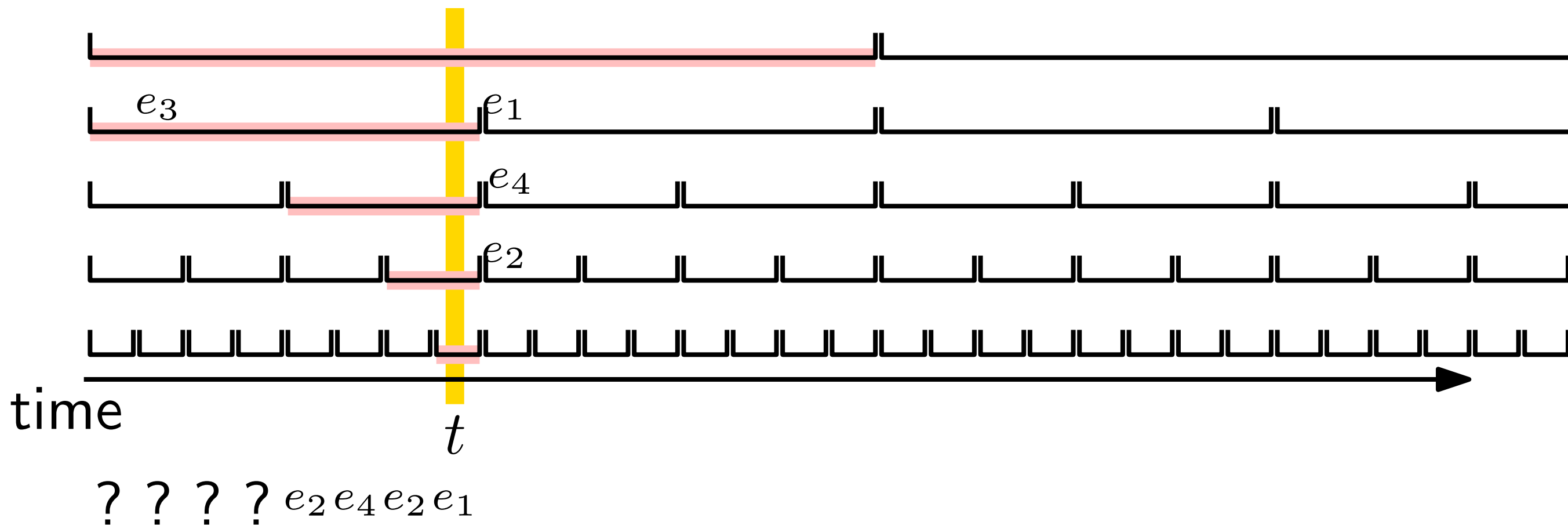
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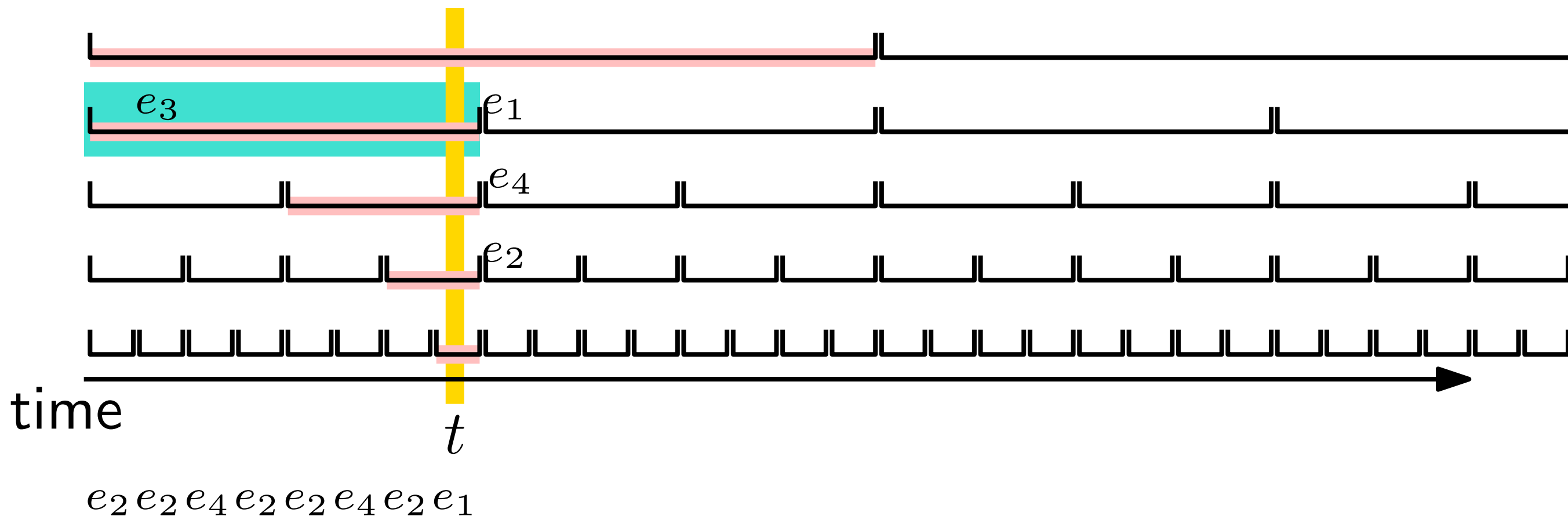
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If any ending bucket is uncleared, fail



Unavoidable interference - moving entities

Sustained x -density implies high ply

Lemma. *For any time interval T with $|T| \geq |E|$, if $\sum_{t \in T} \sum_{e_i \in \mathcal{E}} \frac{1}{r_i(x, t)} \geq c_d |T|$ then any query strategy suffers **ply** $\Omega(x)$ at some time in T .*

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perform speculative queries in parallel

Future Work

A simpler optimal strategy

A distributed optimal strategy

Other measures of interference potential

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Other measures of interference potential

Thank you

Unavoidable interference

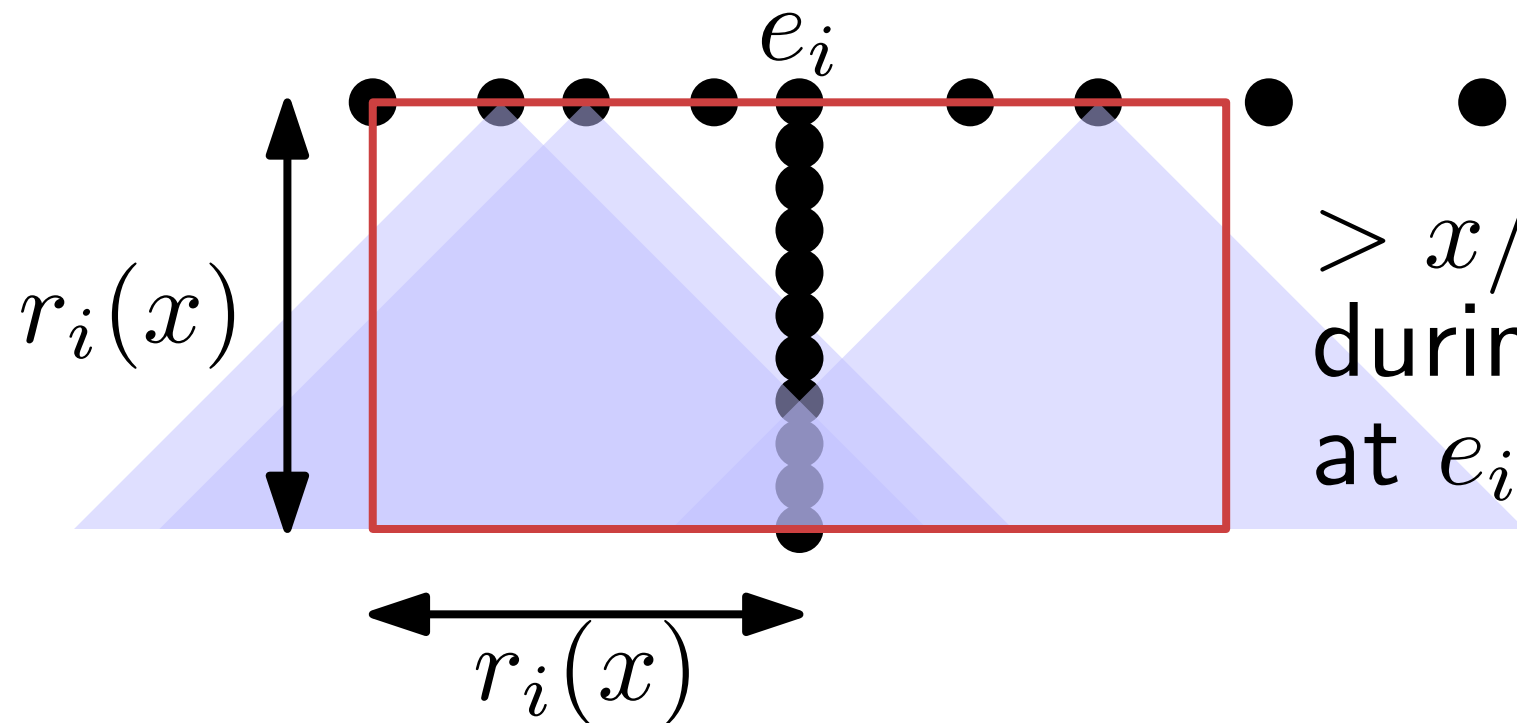
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kissing in dim d

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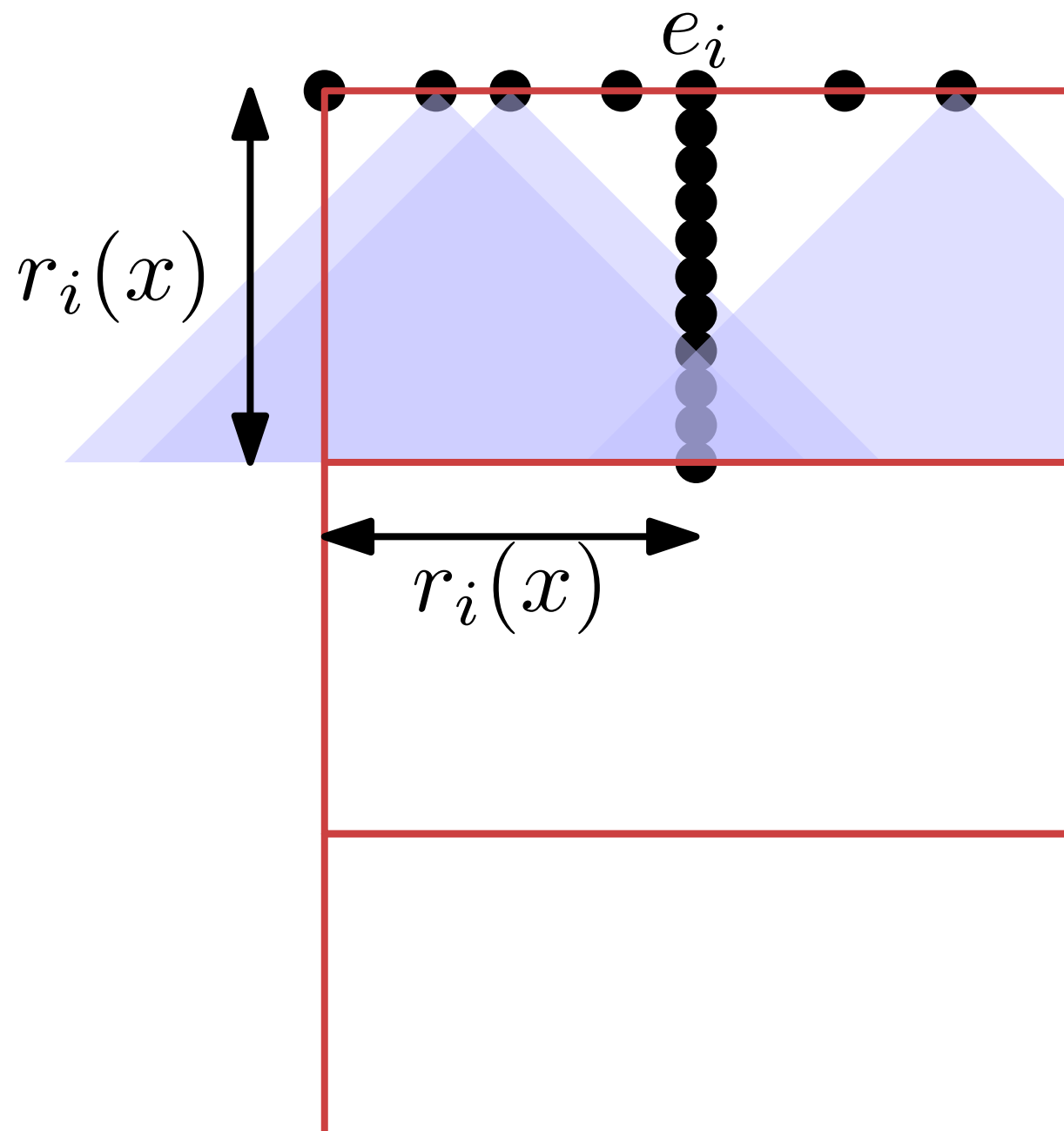
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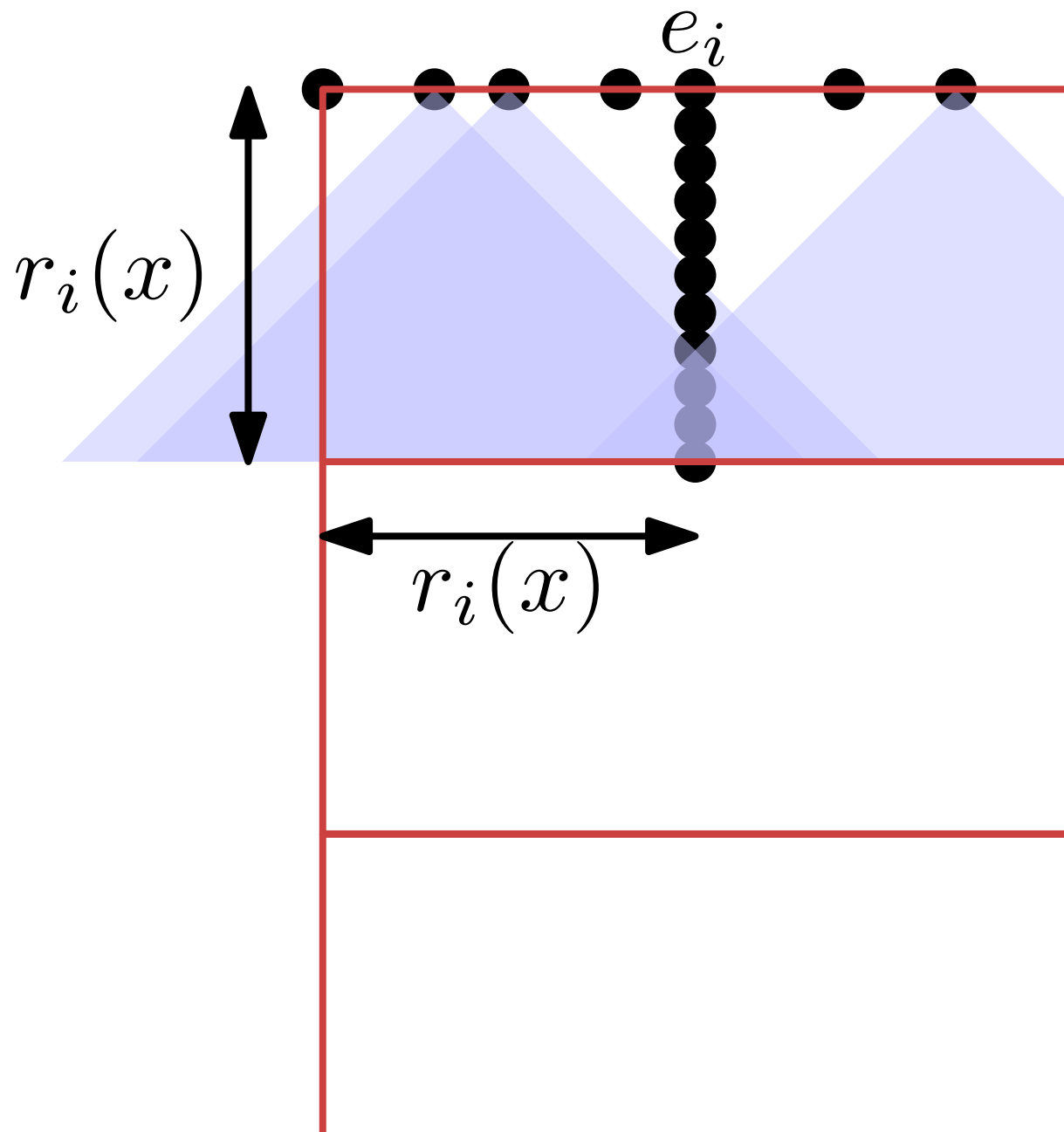
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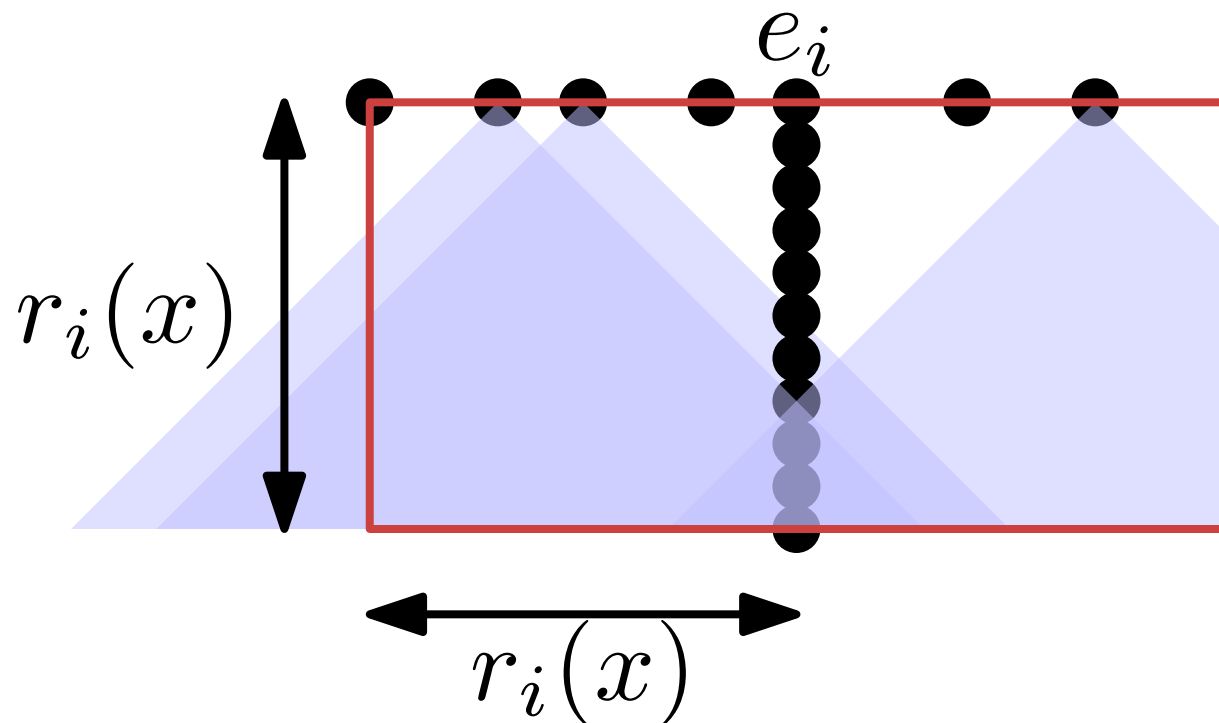
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geometric lemma

Unavoidable interference

kissing in dim d

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$$|\mathcal{E}| = \# \text{queries} \geq \frac{1}{x\kappa_d} \frac{x}{2} \# \text{boxes}$$

$$> \frac{|\mathcal{E}|}{4\kappa_d} \sum_{e_i \in \mathcal{E}} \frac{1}{r_i(x)} \geq |\mathcal{E}|$$



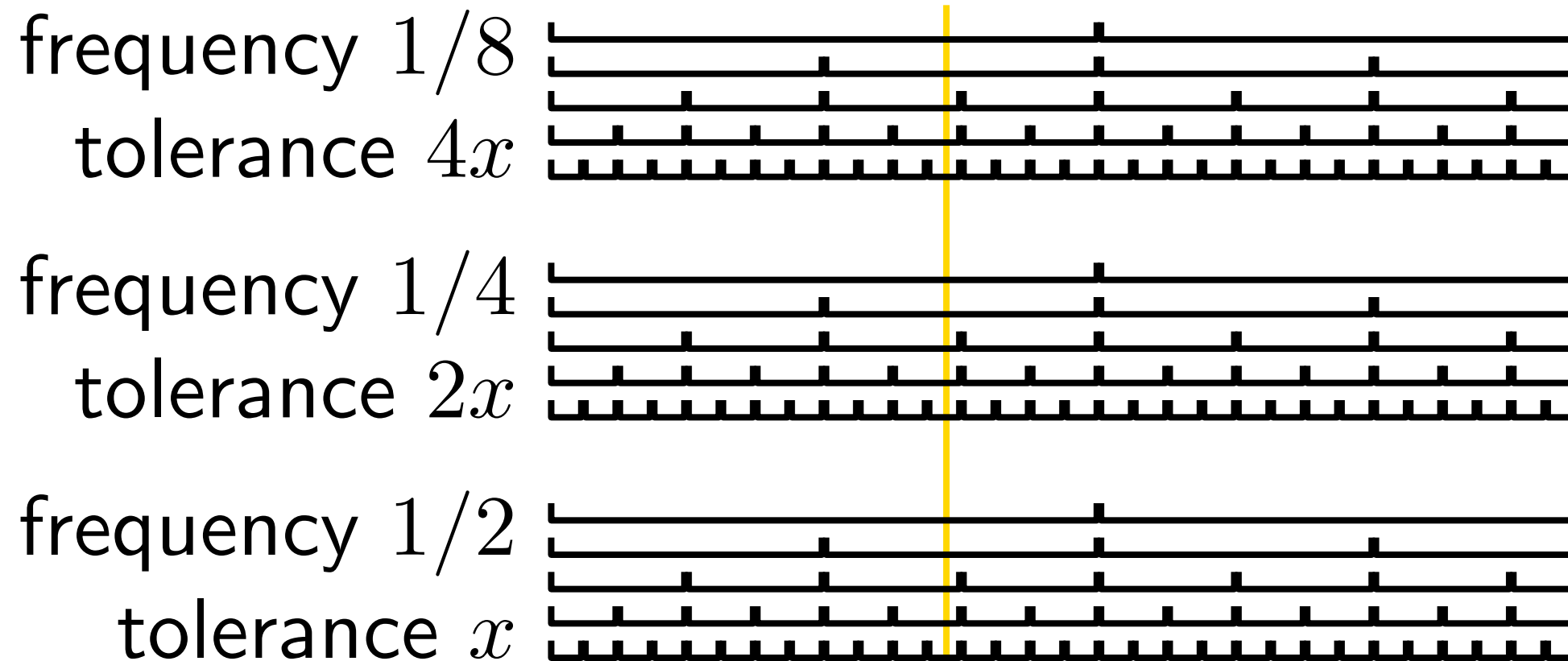
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Adapt to larger tolerance

Rough idea: Run multiple Bucket Strategies in parallel

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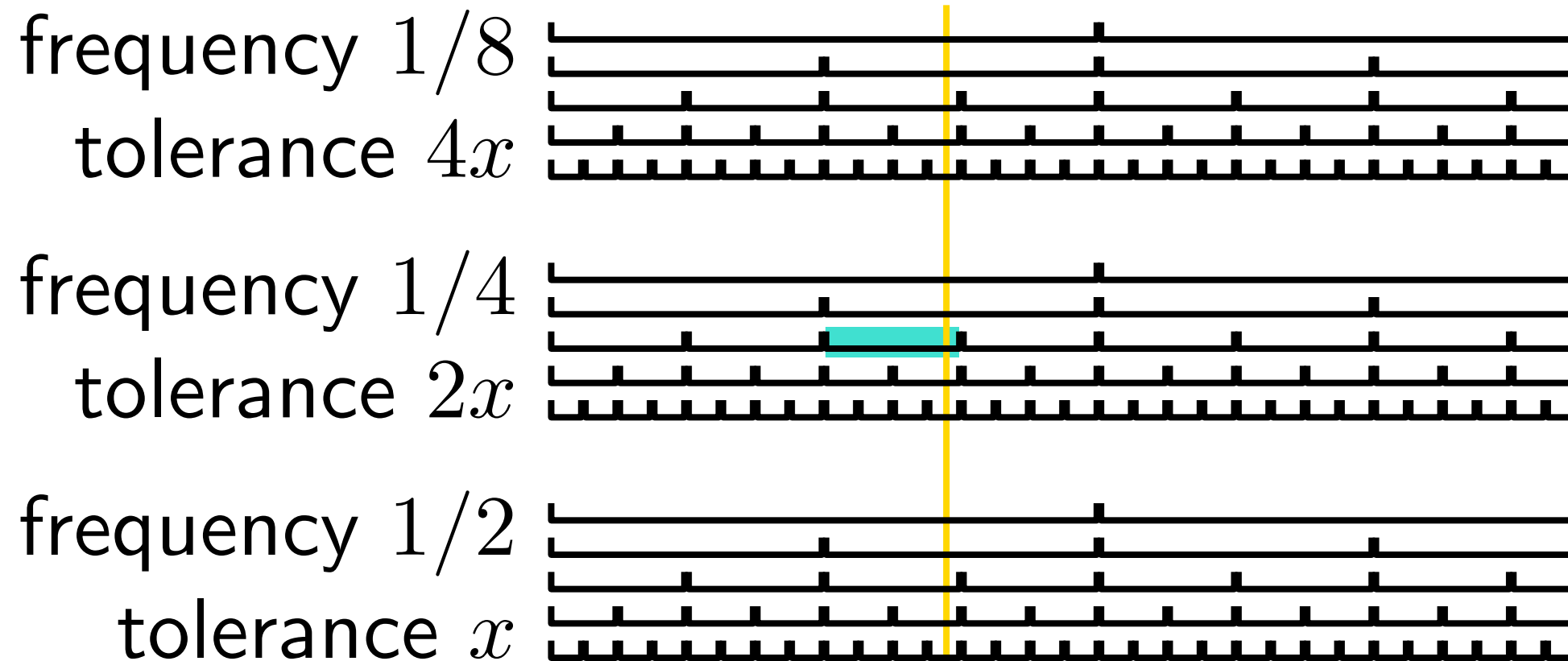
time

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Failure of any implies ply $\Omega(x)$ unavoidable [scaling lem]

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time

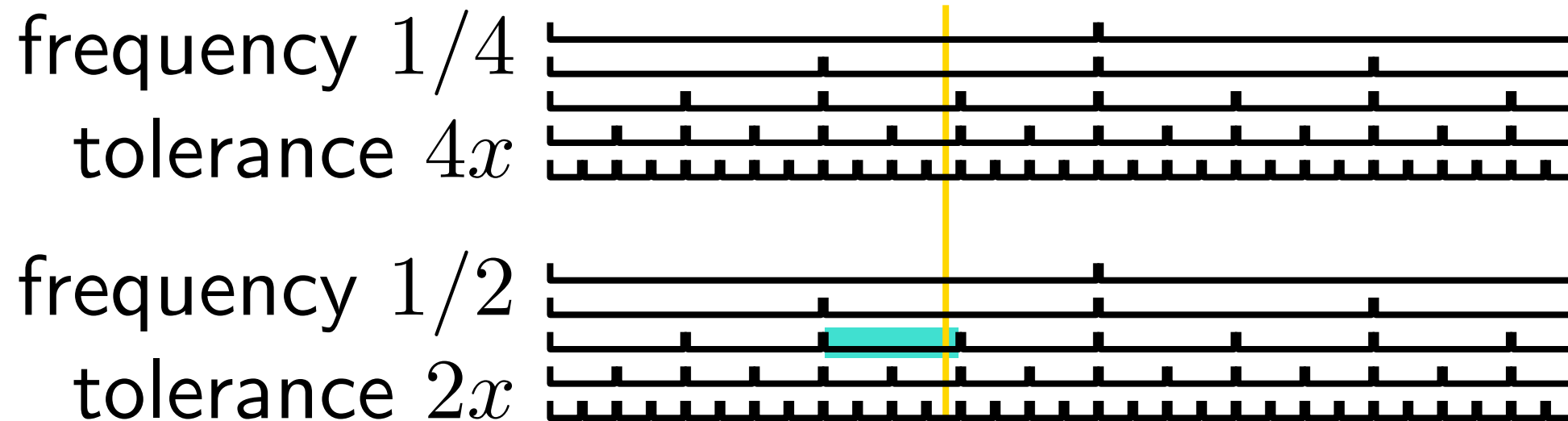
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Stop strategy for x and divvy up its frequency

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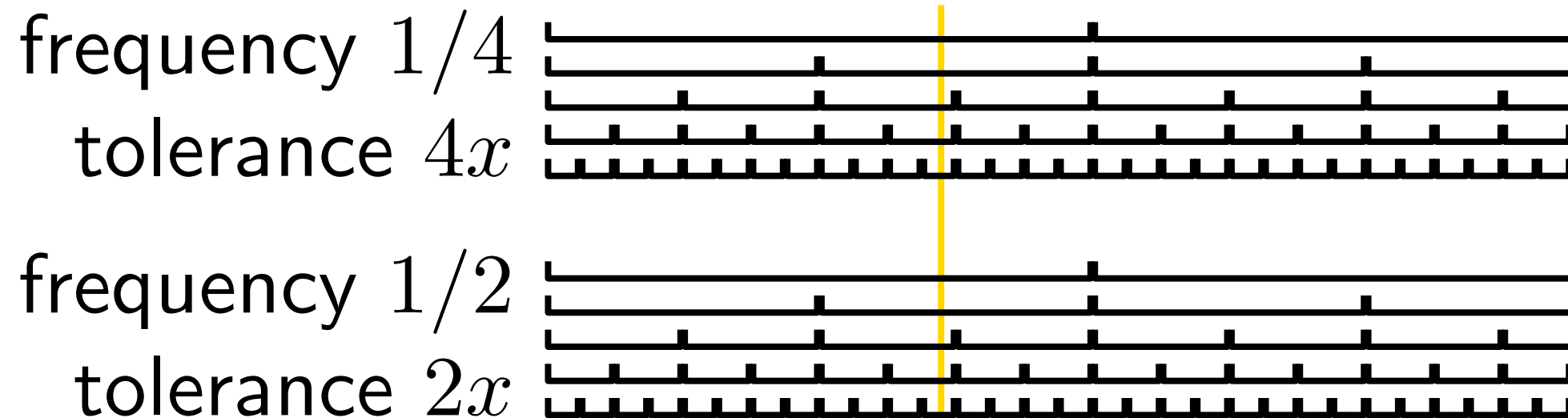
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- Empty all active buckets to special queues
-
-



time

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Round-robin query all entities.

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Let E_0 be those that are **not** $(x/2)$ -safe for n steps

If $|E_0| > n/2$ then restart

If $|E_0| = 0$ then add Bucket Strategy $x/2$

region cannot contain more than
 $x/2$ entities in the next n steps

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Round-robin query all entities.

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for $k = 1$ to $\lg(n)$

Round-robin query E_{k-1} for $n/2^k$ steps

Let E_k be those that are **not** $(x/2)$ -safe for $n/2^k$ steps

If $|E_k| > n/2^k$ then restart

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