

# Running-Time Lower Bound 101

Bundit Laekhanukit

Institute for Theoretical Computer Science  
Shanghai University of Finance and Economics

列卡努奇男，班迪（王班迪）  
上海财经大学，理论计算机科学研究中心

(Based on Works that are not totally mine.)

# This Talk

- The sole purpose of this talk is to **advertise & recruit** (prospective) PhD/Master students & Interns.

Rank institutions in  by publications from  to

**All Areas** [off | on]

**AI** [off | on]

- Artificial intelligence
- Computer vision
- Machine learning & data mining
- Natural language processing
- The Web & information retrieval

**Systems** [off | on]

- Computer architecture
- Computer networks
- Computer security
- Databases
- Design automation
- Embedded & real-time systems
- High-performance computing
- Mobile computing
- Measurement & perf. analysis
- Operating systems
- Programming languages
- Software engineering

**Theory** [off | on]

- Algorithms & complexity
- Cryptography
- Logic & verification

**Interdisciplinary Areas** [off | on]

- Comp. bio & bioinformatics
- Computer graphics
- Economics & computation
- Human-computer interaction

#	Institution	Count	Faculty
1	▶ Carnegie Mellon University	37.4	15
2	▶ Tel Aviv University	35.8	17
3	▶ Stanford University	28.2	18
4	▶ Cornell University	24.4	16
5	▶ Harvard University	21.6	10
6	▶ Technion	21.4	27
7	▶ Massachusetts Institute of Technology	21.2	22
8	▶ University of Pennsylvania	16.6	8
9	▶ Hebrew University of Jerusalem	15.9	17
10	▶ University of Southern California	15.5	8
11	▶ University of Michigan	15.1	11
12	▶ Duke University	14.6	5
13	▼ Shanghai Univ. of Finance and Economics	12.2	5
	<i>Faculty</i>	<i># Pubs</i>	<i>Adj. #</i>
	Pinyan Lu THEORY, ECOM	31	11.7
	Bundit Laekhanukit THEORY	14	5.1
	Nick Gravin THEORY	13	4.1
	Tsz Chiu Kwok THEORY	5	1.4
	Zihe Wang AI, ECOM	4	1.7
14	▶ Columbia University	12.1	9
15	▶ Princeton University	11.6	11
16	▶ Rutgers University	11.4	10
17	▶ University of Washington	10.7	8

# The Real Talk

- Address the question of why we cannot break running-time barriers of some **classical problems**.

# Textbook Problems

that we have already hit the barriers

- SAT, k-SUM, k- Clique, Closest-Pair,
  - Longest-Common Subsequence,
    - All-Pair-Shortest-Paths,
      - Maximum-Flow

# Classical Techniques

difficult and have a lot of limitations

- **Decision Tree Model**

Sorting, 2D Closest-Pair, Shortest-Path  
limited to comparison based machines

- **Circuit Models**

k-Cliques, k-Set cover, k-Dominating Set  
limited to some class of circuits

- **Adversarial Models**

Data Structures, Online Algorithms  
limited to some classes of algorithms

# Modern Techniques

give up improving the known algorithms

- Assume that the known algorithms are the **best possible** ones!
- Deduce running-time lower-bounds from **these** given up problems!

# Popular Hypotheses

sources of hardness for others problems

- **ETH:** SAT has no  $2^{o(n)}$ -time algorithm.
- **SETH:** SAT has no  $2^{(1-\epsilon)n}$ -time algorithm.
- **k-SUM:** Find  $k$  integers from  $S \subseteq [-n^2, n^2]$  that sum to zero requires  $n^{k/2-\epsilon}$ -time.
- **FPT  $\neq$  W[1]:**  $k$ -Clique has no  $T(k)$   $\text{poly}(n)$ -time algorithm.
- **ATSP:** All-Pair Shortest-Path has no  $n^{(3-\epsilon)}$ -time algorithm.



# Warming-Ups

lower-bounds based on SAT (SETH)

- Reducing NP-Complete problems to P!

SAT  $\rightarrow$  k-Set-Cover & (Bichromatic) Closest Pairs.

# Warming-Ups 1

- SAT  $\rightarrow$  k-Set Cover

# Satisfiability Problem (SAT)

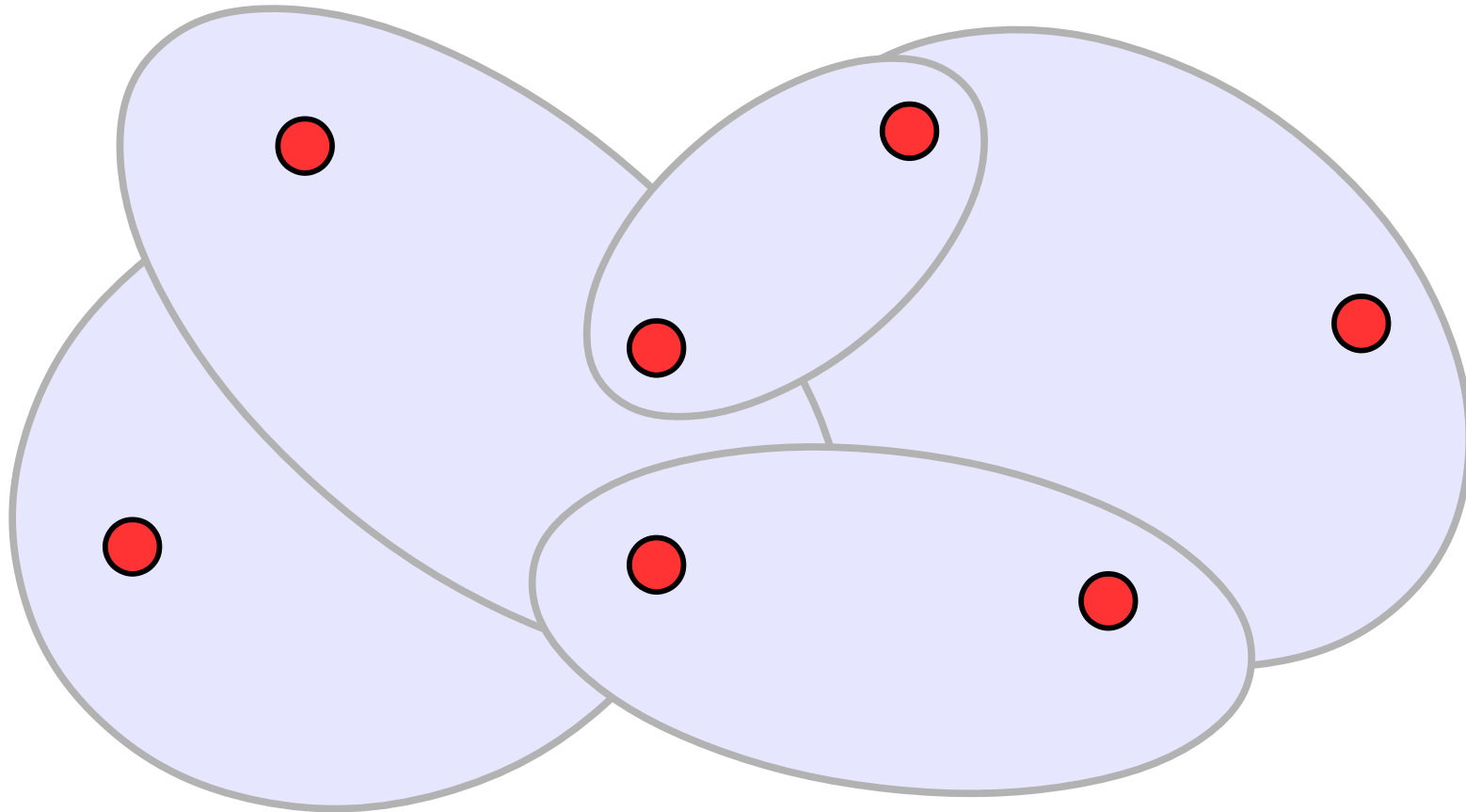
**Given** a CNF formula I (formula: (... or ...) and (... or ...) and (... or ...) .)

e.g.,  $(x_1 \text{ or } (\text{not } x_2) \text{ or } x_3) \text{ and } (x_2 \text{ or } x_3 \text{ or } (\text{not } x_4))$

**Goal:** decide whether I is satisfiable.

# k-Set Cover (k-SCP)

Given a collection of sets  $S_1, \dots, S_n$  and elements  $e_1, \dots, e_m$   
Decide whether there are **k sets** that covers all the elements.

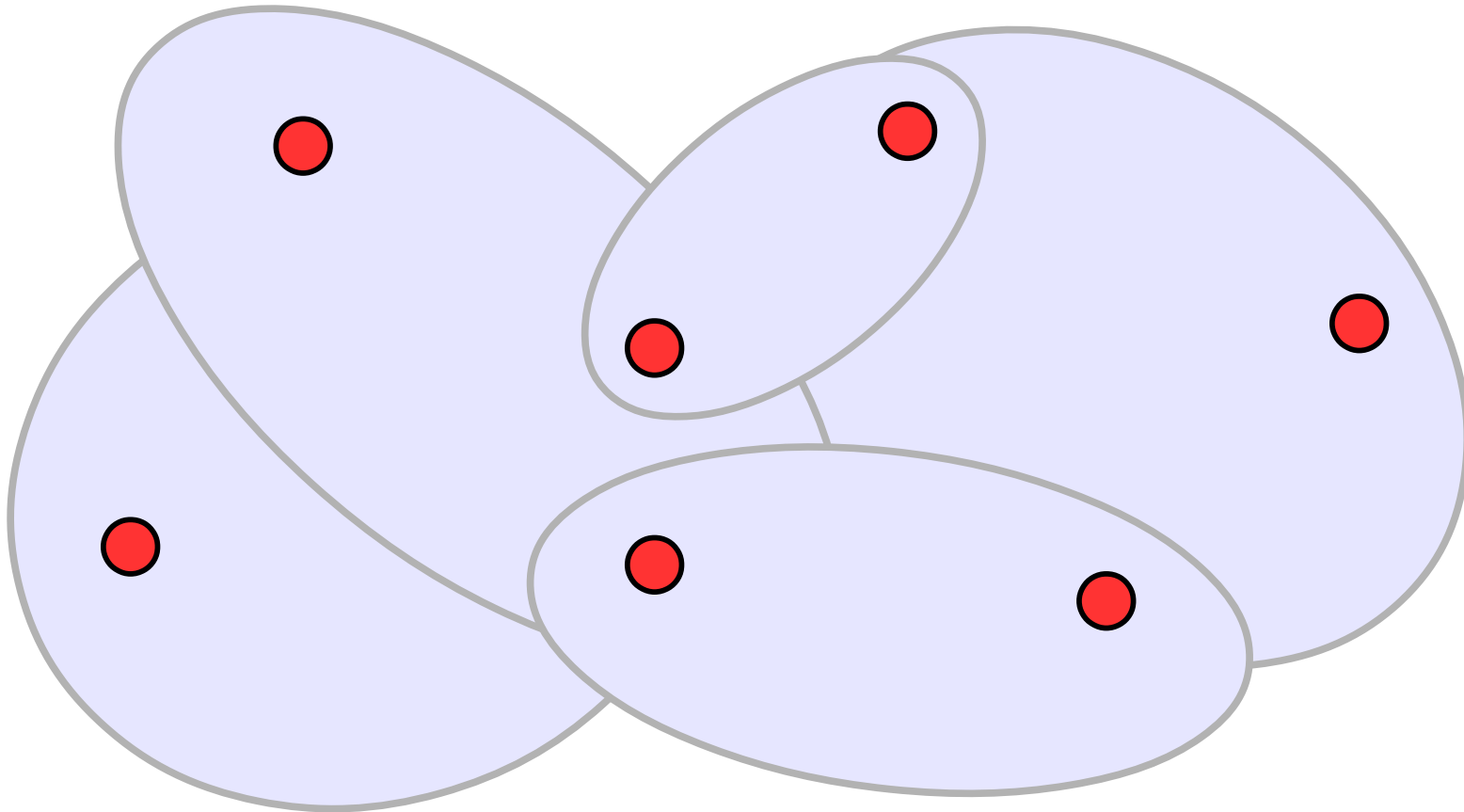


# SAT $\rightarrow$ k-Set Cover

We want to show k-SCP cannot be solved in  $n^{(0.99)k}$  time unless SAT can be solved in  $2^{0.99n}$  time.

# SAT $\rightarrow$ (n)-Set Cover

List all possible settings of each **variables as sets**.  
List all **clauses as elements**.



# SAT $\rightarrow$ (n)-Set Cover

List all possible settings of each variables as sets.

List all clauses as elements.

# SAT $\rightarrow$ $k$ -Set Cover

We want to show  $k$ -SCP cannot be solved in  $n^{(0.99)^k}$  time unless SAT can be solved in  $2^{0.99n}$  time.

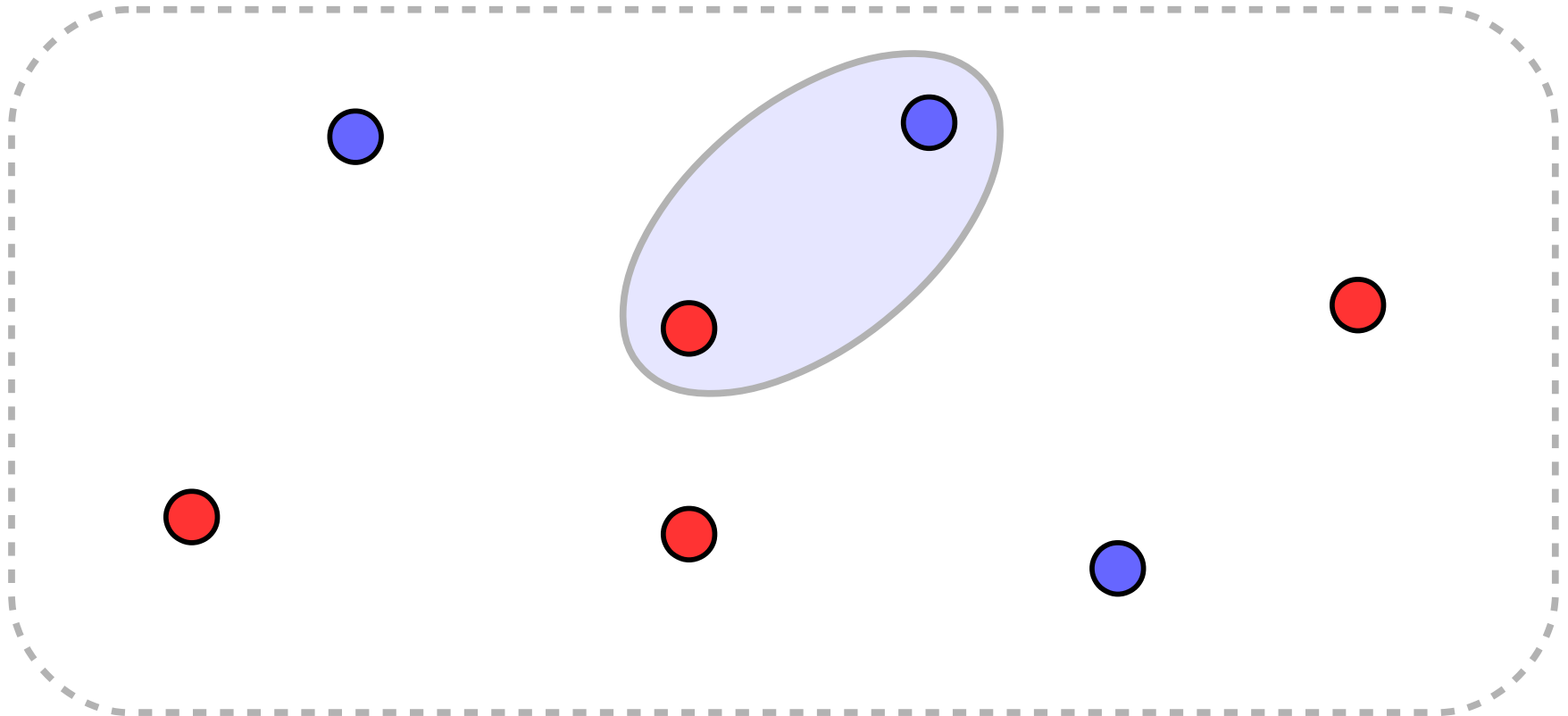


# Warming-Ups 2

- SAT  $\rightarrow$  Bi-Chromatic Closest Pair

# Bi-Chromatic Closest Pair (BCP)

Given a collection of  $n$  **red** and  $n$  **blue** points in a  $d$ -dimensional metric, find a pair of **red-blue** points with minimum-distance.



# Satisfiability Problem (SAT)

**Given** a CNF formula I (formula: (... or ...) and (... or ...) and (... or ...) .)

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**Goal:** decide whether I is satisfiable.

# SAT $\rightarrow$ BCP

**Goal:** prove  $n^2$  time lower bound for BCP.

**Hint:** Similar to SAT  $\rightarrow$  2-SCP

# Second Part of the Talk

- Complexity of Closest Pair
- Geometric Representation of Graphs

# Complexity of Closest Pair via Polar Pair of Point-Sets

Joint work with



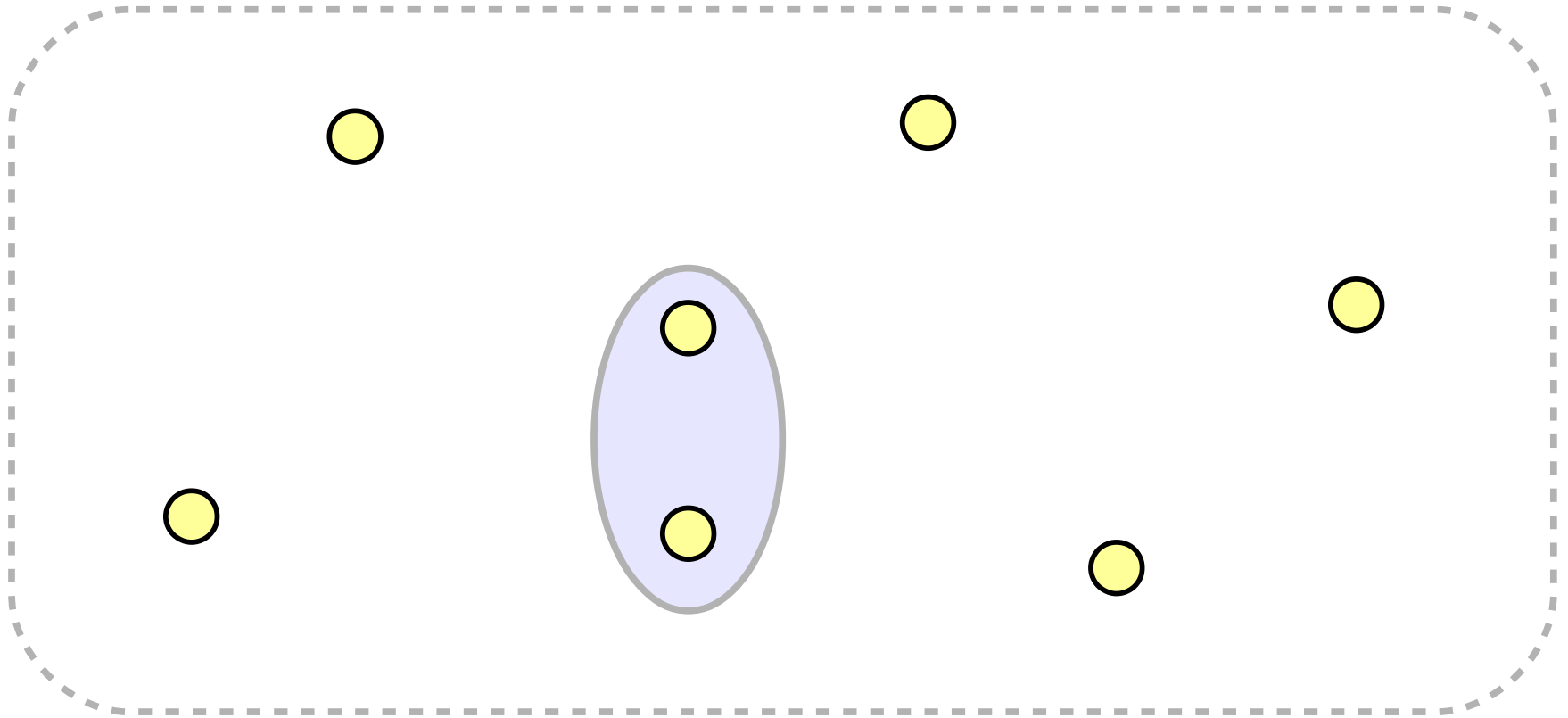
Karthik C. S.  
Weizmann Institute



Roe David  
Datorama

# Closest Pair (CP)

Given a collection of  $n$  points in a  $d$ -dimensional metric, find a pair of points with minimum-distance.



# Known Algorithms

- Euclidean Closest Pair
  - Dimension  $d=O(1)$ :
    - $O(2^D n \log n)$  (deterministic) [Bentley-Shamos'76]
    - $O(2^D n)$  (randomized) [Rabin'76, Khuller-Mattias'95]
  - Dimension  $d=\Theta(\log n)$ 
    - $O(d n^2)$  (trivial algorithm)
  - Dimension  $d=n$ :  $O(n^{3-\epsilon})$ , for some  $\epsilon > 0$



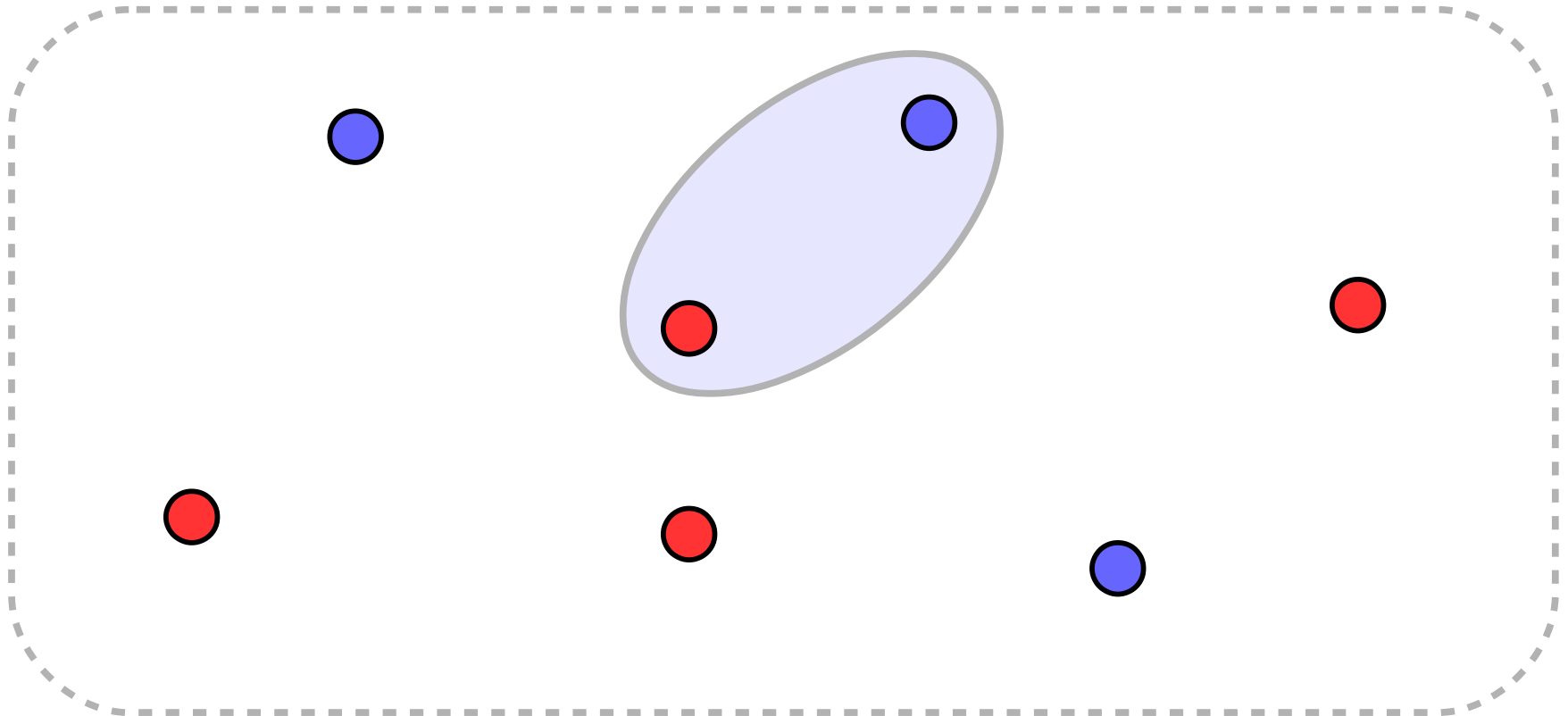
Is there an  $O(n^{1.9})$ -time algorithm  
when dimension  $d = \Omega(\log n)$ ?

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**Don't know** for Euclidean Closest Pair.  
**No** for the **bichromatic** variant.

# Bi-Chromatic Closest Pair (BCP)

Given a collection of  $n$  **red** and  $n$  **blue** points in a  $d$ -dimensional metric, find a pair of **red-blue** points with minimum-distance.



Bi-Chromatic Closest Pair  
has no  $O(n^{1.9})$ -time algorithm  
for any  $L^p$ -metric  
unless SAT has  $(2^{1.9n})$ -time algorithm

Alman-Williams 2015

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Alman-Williams 2015

Even  $(1+o(1))$ -approx in  $O(n^{1.9})$ -time is not possible.

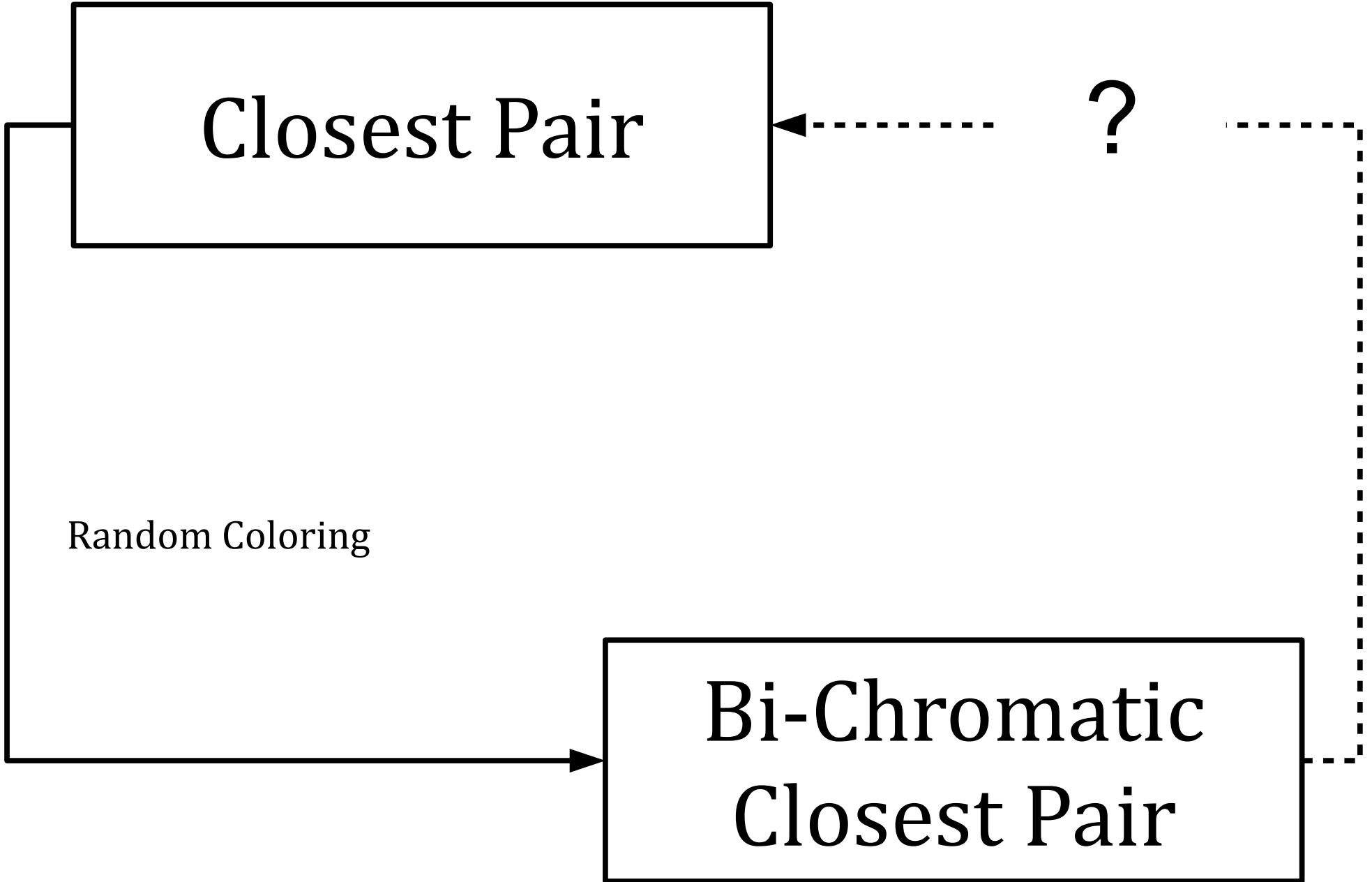
Rubinfeld 2018

Closest Pair

?

Random Coloring

Bi-Chromatic  
Closest Pair



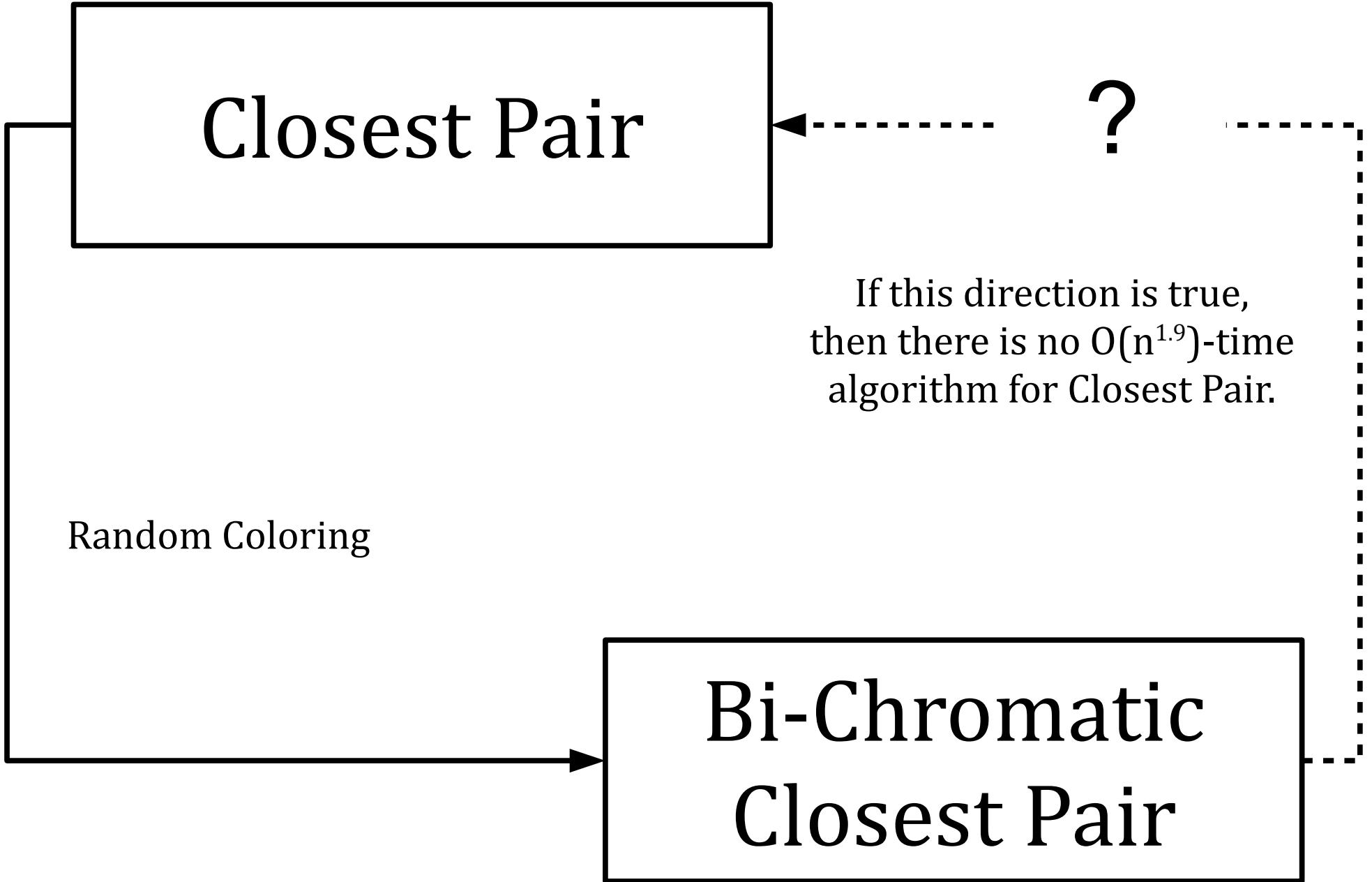
Closest Pair

?

If this direction is true,  
then there is no  $O(n^{1.9})$ -time  
algorithm for Closest Pair.

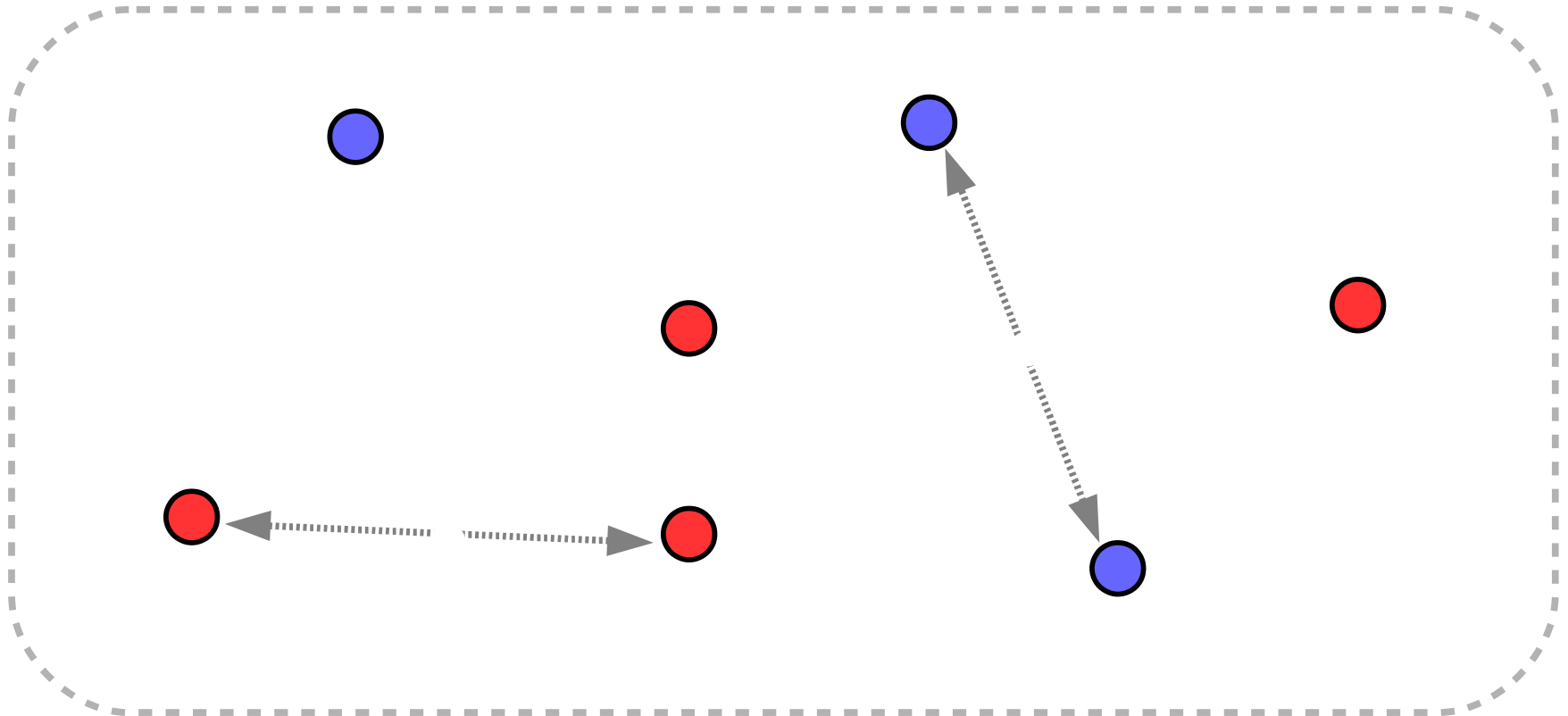
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Bi-Chromatic  
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# Reduction BCP $\rightarrow$ CP

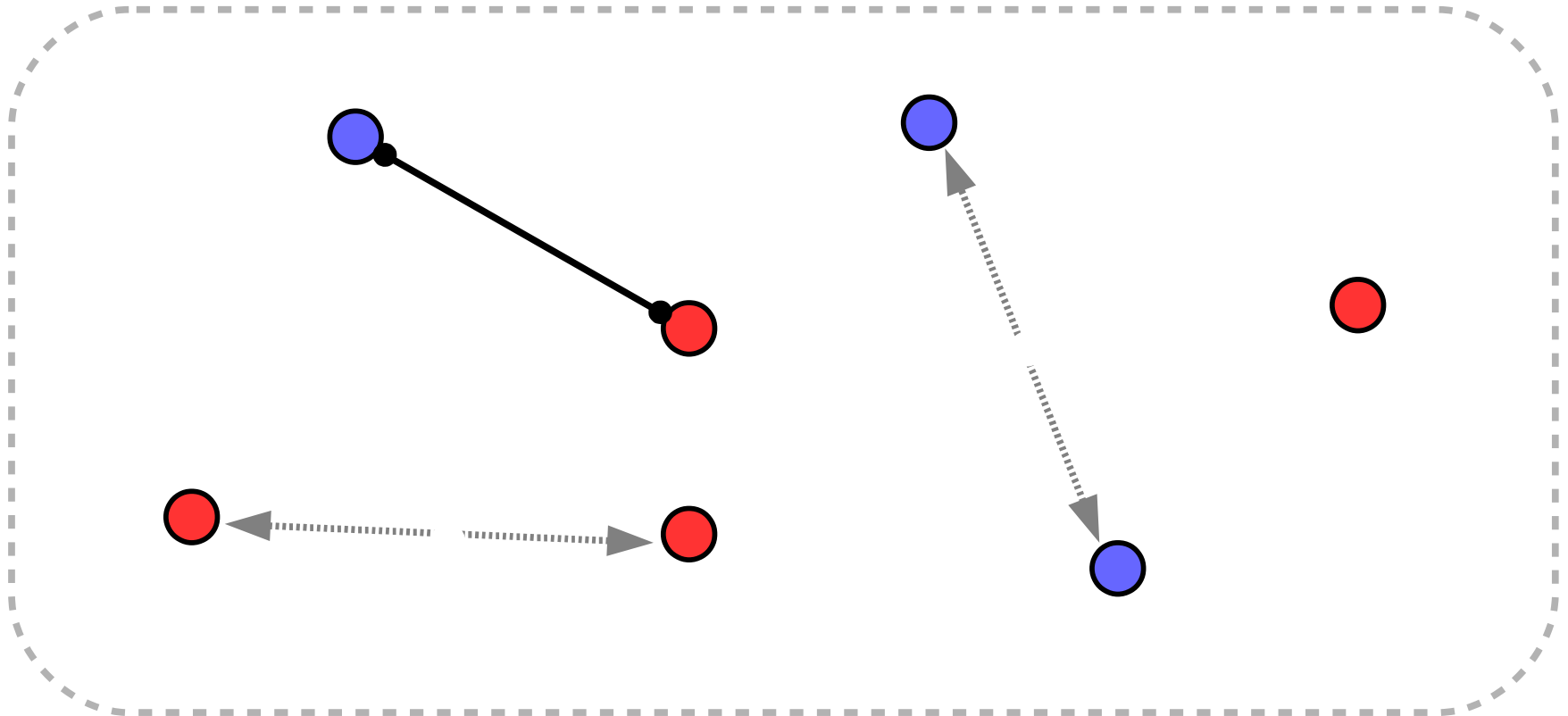
Enlarge **Red-Red**, **Blue-Blue** distances.





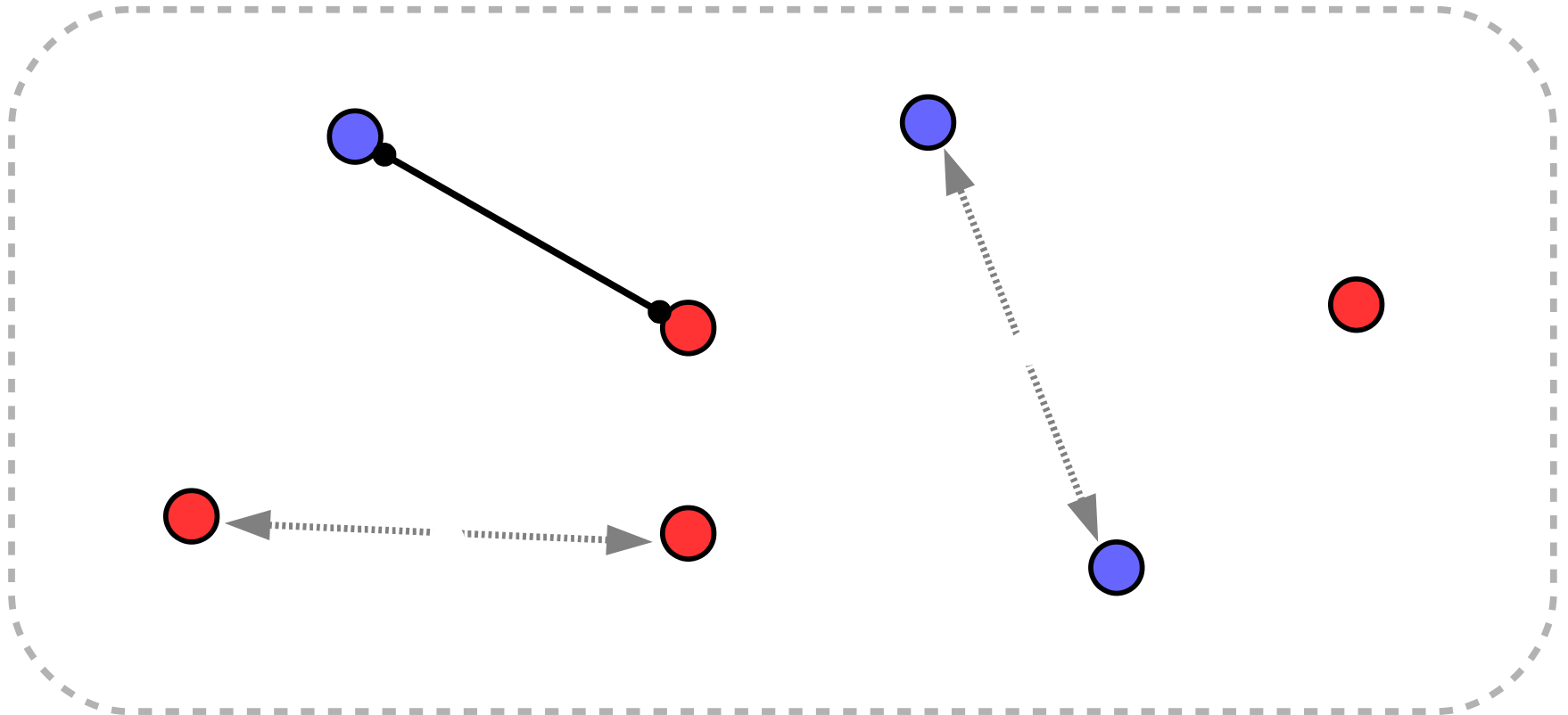
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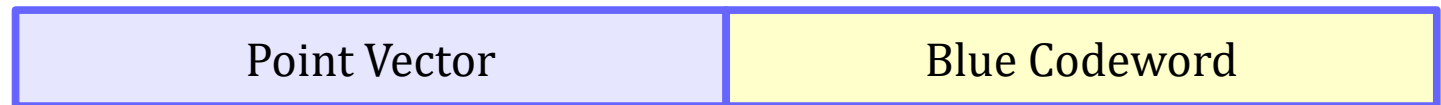
# Reduction BCP $\rightarrow$ CP

Concatenate point-vectors with codewords



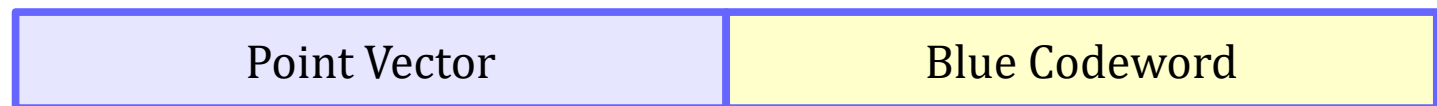
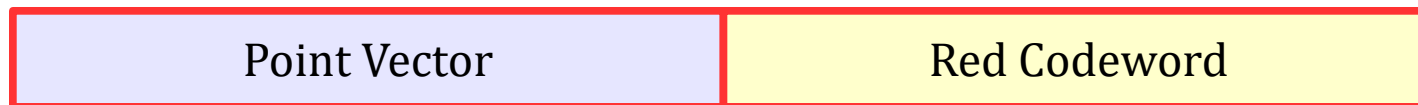
# Reduction BCP $\rightarrow$ CP

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# Reduction BCP $\rightarrow$ CP

Concatenate point-vectors with codewords



## Needed Properties of The Codewords

(Bi-Clique Property)

$$\text{Distance}(\text{Red-Code}, \text{Red-Code}') \geq R + 1/n$$

$$\text{Distance}(\text{Blue-Code}, \text{Blue-Code}') \geq R + 1/n$$

$$\text{Distance}(\text{Red-Code}, \text{Blue-Code}) = R$$

The existence of Codewords with  
Bi-Clique Property implies  $\text{BCP} \rightarrow \text{CP}$   
(that runs in  $O(n^{1.9})$ -time)

# The existence of Codewords with Bi-Clique Property implies BCP $\rightarrow$ CP (that runs in $O(n^{1.9})$ -time)

## Proof

Scale each point so that maximum distance  $\leq 1/n$ .

Concatenate each red/blue point with red/blue codewords.

For any (new) red-points  $\text{red} = r_1 \cdot rc_1$  and  $\text{red}' = r_2 \cdot rc_2$

$$\text{dist}(\text{red}, \text{red}') = (\text{dist}(r_1, r_2)^2 + \text{dist}(rc_1, rc_2)^2)^{1/2} > R + 1/n$$

( since  $\text{dist}(\text{red-code}, \text{red-code}') > R + 1/n$  )

For any (new) red & blue point  $\text{red} = r \cdot rc$  and  $\text{blue} = b \cdot bc$

$$\text{dist}(\text{red}, \text{blue})^2 = (\text{dist}(r, b)^2 + \text{dist}(rc, bc)^2)^{1/2}$$

$$= (\text{dist}(r, b)^2 + R^2)^{1/2} < (1/n + R^2)^{1/2} < \text{dist}(\text{red}, \text{red}')$$

$\Rightarrow$  Any red-blue closest-pair is the closest-pair in the new instance.



# The existence of Codewords with Bi-Clique Property implies BCP $\rightarrow$ CP (that runs in $O(n^{1.9})$ -time)

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$$\begin{aligned} \text{dist}(\text{red}, \text{blue})^2 &= \left( \text{dist}(r, b)^2 + \text{dist}(rc, bc)^2 \right)^{1/2} \\ &= \left( \text{dist}(r, b)^2 + R^2 \right)^{1/2} < \left( 1/n + R^2 \right)^{1/2} < \text{dist}(\text{red}, \text{red}') \end{aligned}$$

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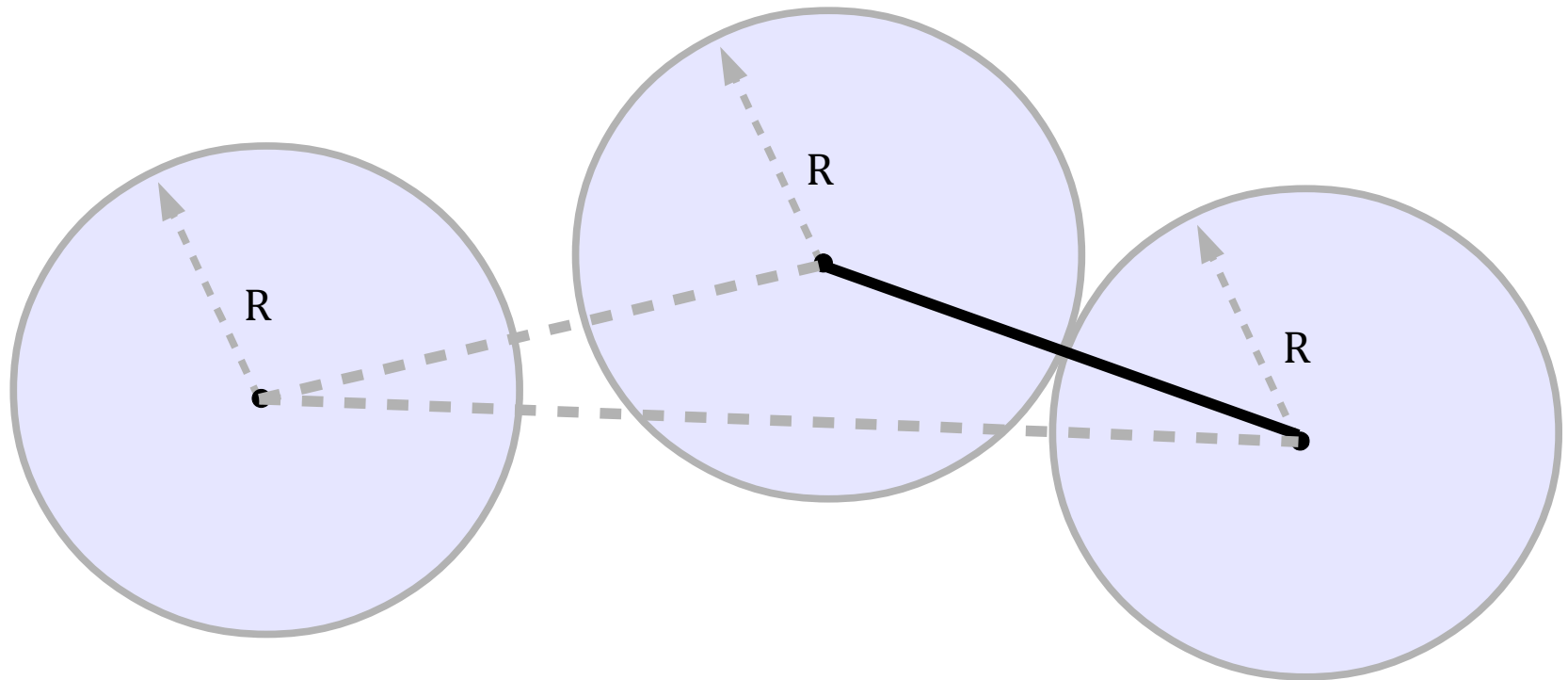


The existence of Codewords with  
Bi-Clique Property implies  $\text{BCP} \rightarrow \text{CP}$   
(that runs in  $O(n^{1.9})$ -time)

Requires codewords construction with  
running time  $O(n^{1.9})$  & dimension  $O(\log n)$



# Complexity Question of CP reduces to Geometric Representation of Bi-Clique

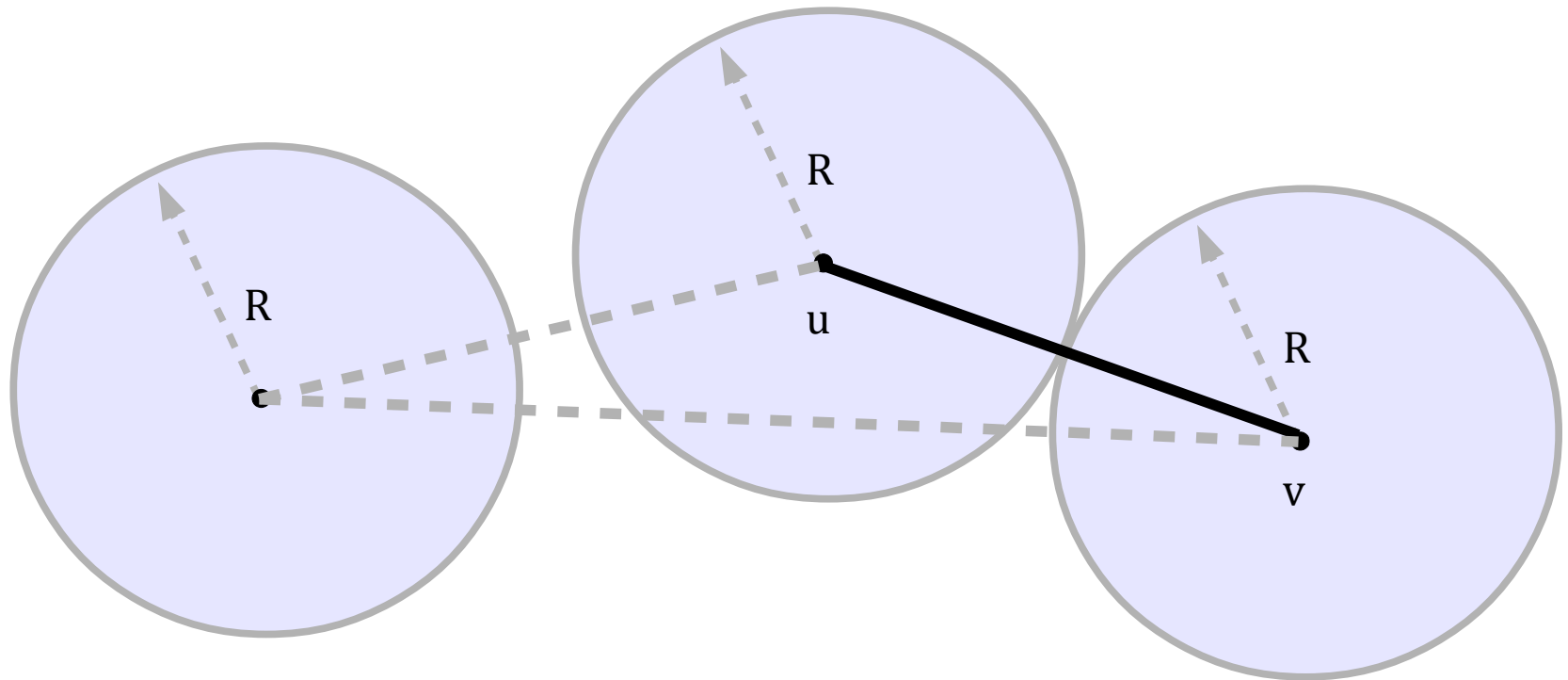


# Complexity Question of CP reduces to Geometric Representation of Bi-Clique

What is the smallest dimension to  
represent a bi-clique in  $L^p$ -metric?

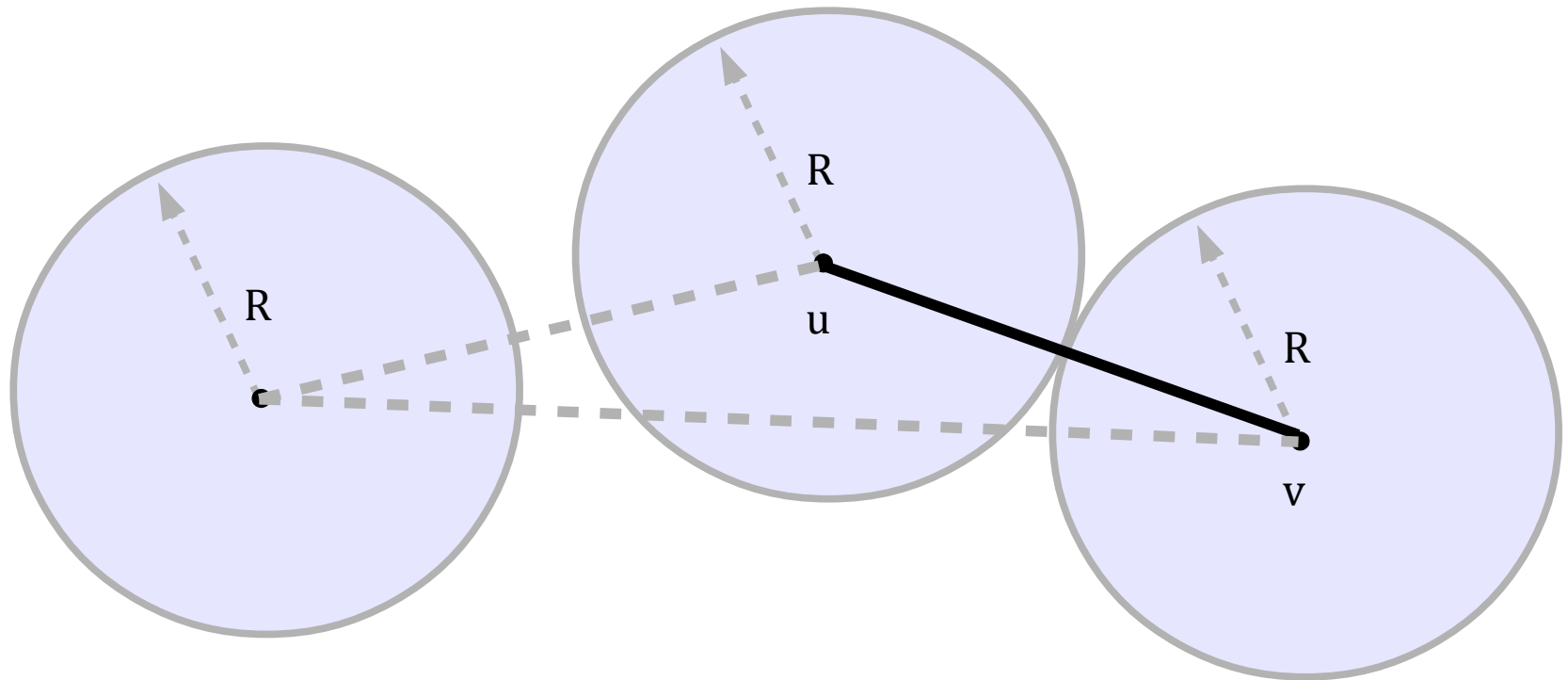
# Contact-Graph

Vertices are non-overlapping  $d$ -dimensional spheres of radius  $R$ .  
There is an edge  $uv$  if  $\text{Sphere}(u)$  touches  $\text{Sphere}(v)$ .



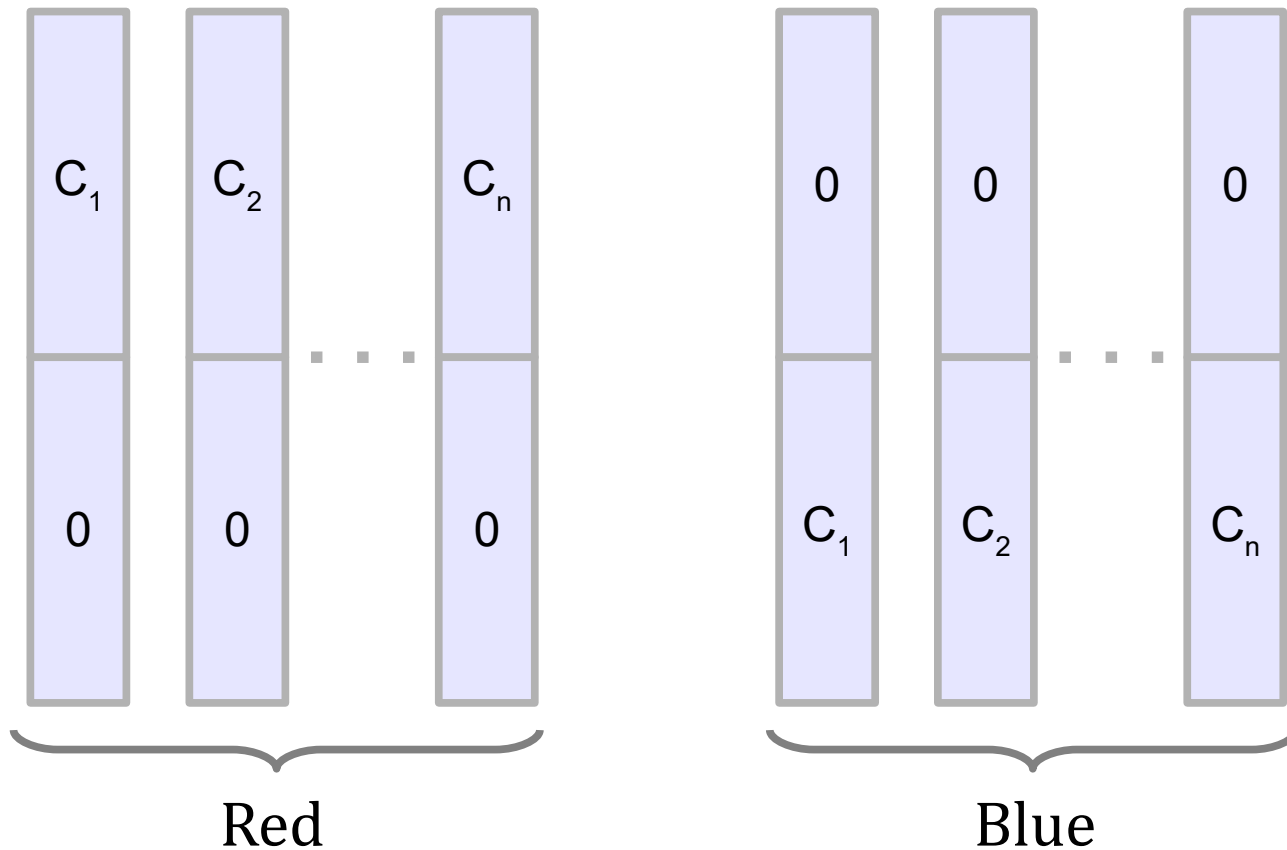
# Contact-Dimension of Bi-Clique in $L^p$

$\text{bicd}(L^p)$  = the smallest  $d$  such that  $K_{n,n}$  can be represented by a contact graph in the  $d$ -dimensional  $L^p$  metric.



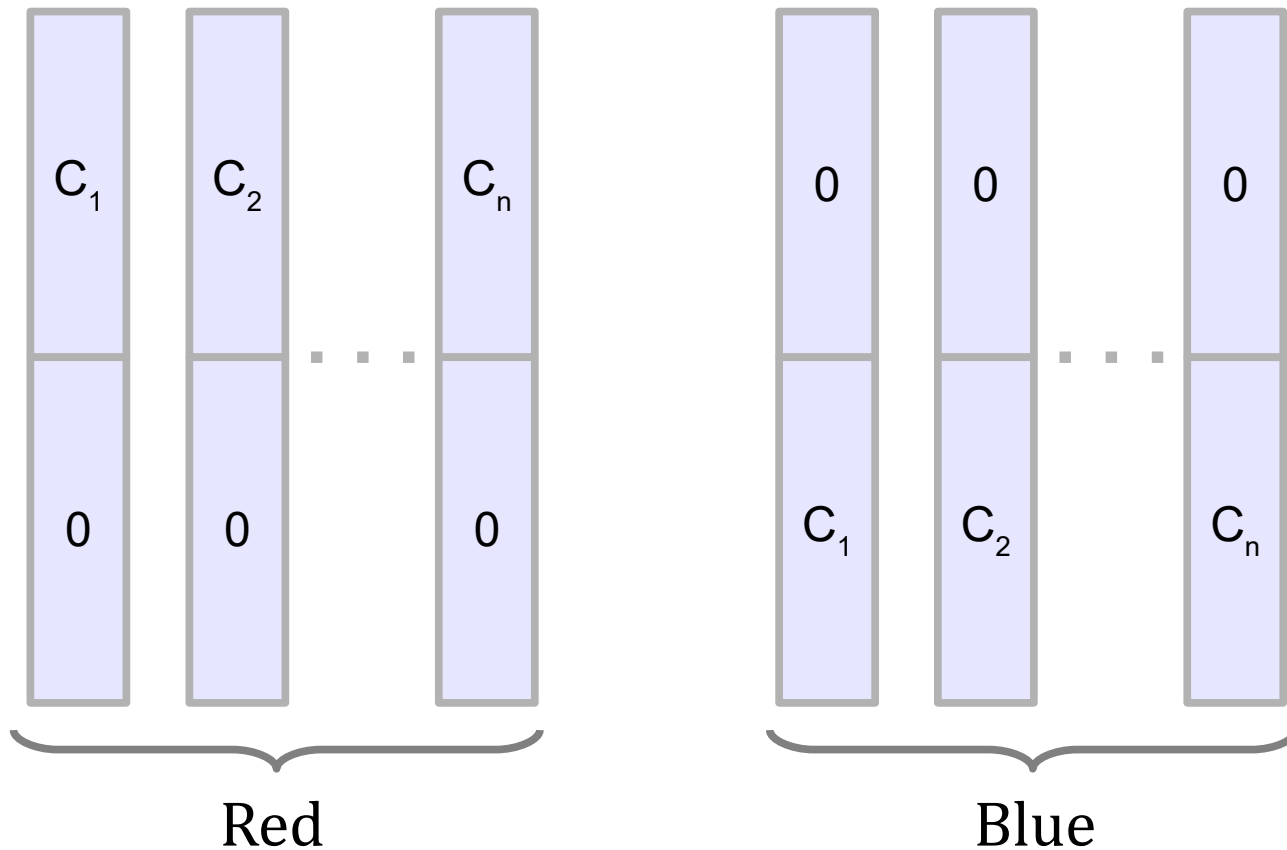
$$\text{bicd}(L^p) \leq O(\log n) \text{ for } p > 2$$

Concatenate random codewords  $C$  in  $\{1,-1\}^n$  with  $0^n$   
Red-codeword =  $C \cdot 0^n$ , Blue-codeword =  $0^n \cdot C$



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$$\begin{aligned} \text{dist}(\text{red}, \text{blue})^p &= 2n \\ \text{dist}(\text{red}, \text{red}')^p &> (\tfrac{1}{2} - \varepsilon) n \cdot 2^p \\ &> 2n \end{aligned}$$

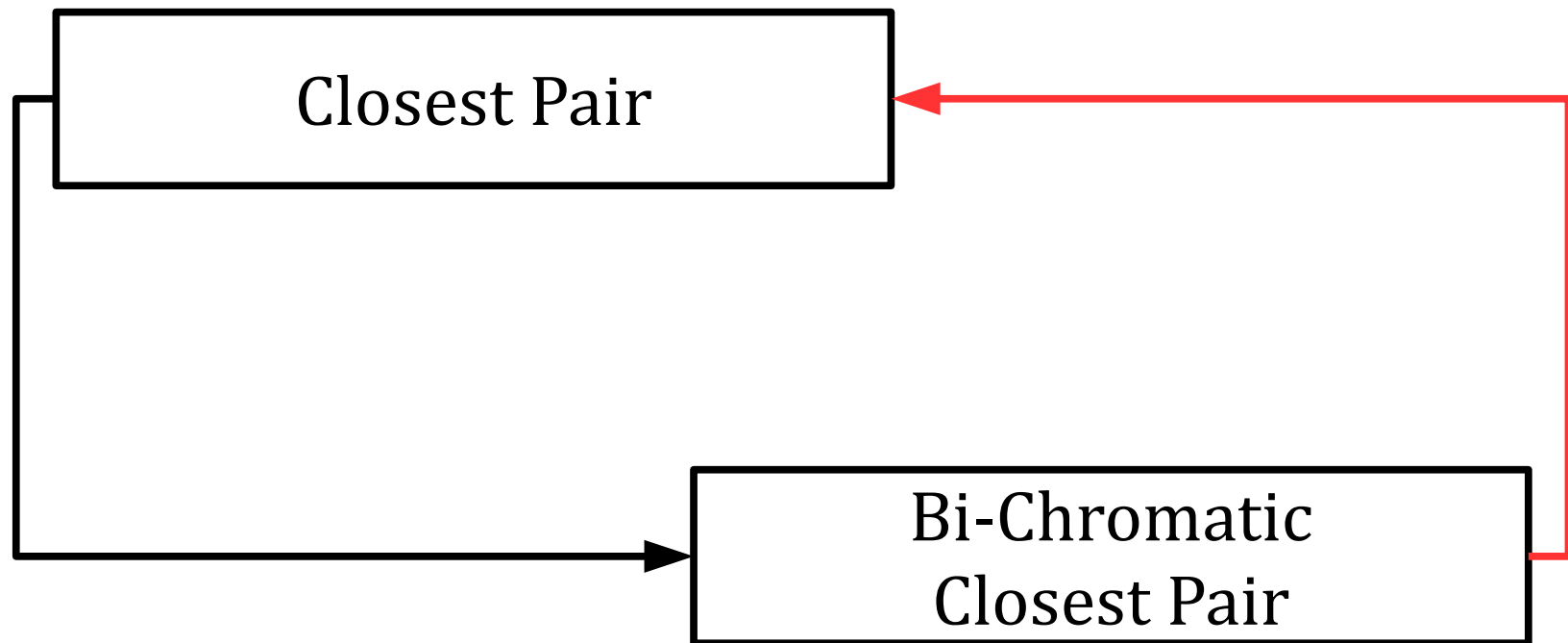
(with high probability)

CP & BCP are equivalent in  $L^p$ -metrics.

(under subquadratic-time reduction)

# CP & BCP are equivalent in $L^p$ -metrics.

(under subquadratic-time reduction)





How about other  $L^p$ -metrics?

# How about other $L^p$ -metrics?

**Yes** for  $L^\infty$ , **No** for  $L^0$  and  $L^2$ , **Don't know** for  $L^1$

$$1.286 n \leq \text{bicd}(L^2) \leq 1.5 n$$

Maehara 1985, Frankl-Maehara 1988

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Biclique has no contact-graph  
in  $O(\log n)$ -dimensional  $L^2$ -metric.

$$\begin{aligned}
n &\leq \text{bicd}(L^0) \leq n \text{ (hamming metric)} \\
? &\leq \text{bicd}(L^1) \leq n^2 \\
? &\leq \text{bicd}(L^p) \leq n \text{ for } 1 < p < 2 \\
\Omega(\log n) &\leq \text{bicd}(L^\infty) \leq 2 \log_2 n
\end{aligned}$$

David, Karthik CS, L. 2018

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David, Karthik CS, L. 2018

Biclique has no contact-graph  
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# Current Bounds

## for Biclique Contact Dimension

$n$	$\leq \text{bicd}(L^0)$	$\leq n$	
$?$	$\leq \text{bicd}(L^1)$	$\leq n^2$	
$?$	$\leq \text{bicd}(L^p)$	$\leq n$	for $1 < p < 2$
$1.286 n$	$\leq \text{bicd}(L^2)$	$\leq 1.5 n$	
$\Omega(\log n)$	$\leq \text{bicd}(L^p)$	$\leq O(\log n)$	for $p > 2$
$\Omega(\log n)$	$\leq \text{bicd}(L^\infty)$	$\leq 2 \log_2 n$	

# Open Problems

- Better Lower / Upper Bounds for  $L^1$  and  $L^2$  ?
  - An alternative way to reduce  $BCP \rightarrow CP$  ?



# Open Problems

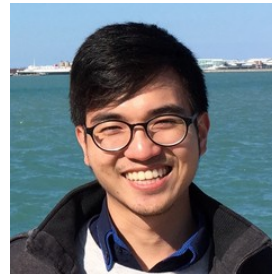
- Better Lower / Upper Bounds for  $L^1$  and  $L^2$  ?
  - An alternative way to reduce  $BCP \rightarrow CP$  ?

# Open problem **solved**: Bichromatic & Classical Closest Pair are equivalent.

Recent work of



Karthik C. S.  
Weizmann Institute



Pasin Manurangsi  
UC Berkeley

# The End

Thank you for your attention.

Questions?

# Third Part of the Talk

(extended part)

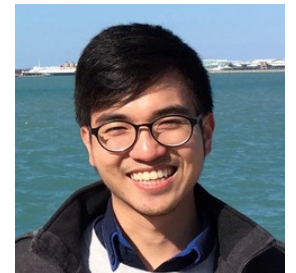
- Getting Running-Time Lower bound  
for **Approximation** Algorithms

# On the Parameterized Complexity of Approximating Dominating Set

Joint work with



Karthik C. S.  
Weizmann Institute



Pasin Manurangsi  
UC Berkeley

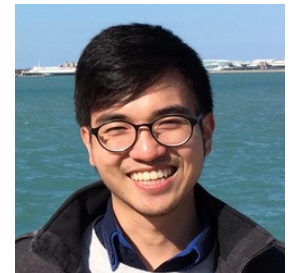
# On the Parameterized Complexity of Approximating Dominating Set

Equivalent to Set Cover

Joint work with



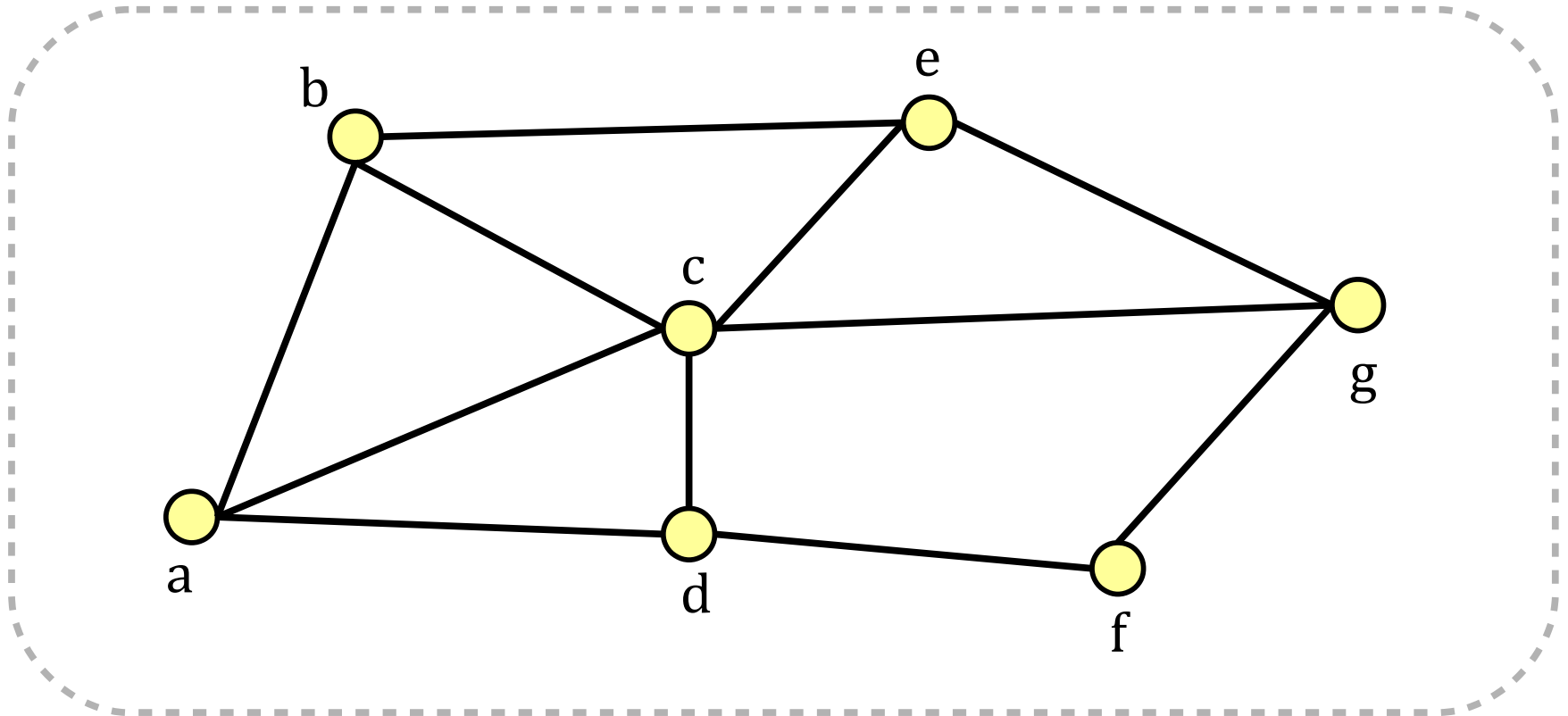
Karthik C. S.  
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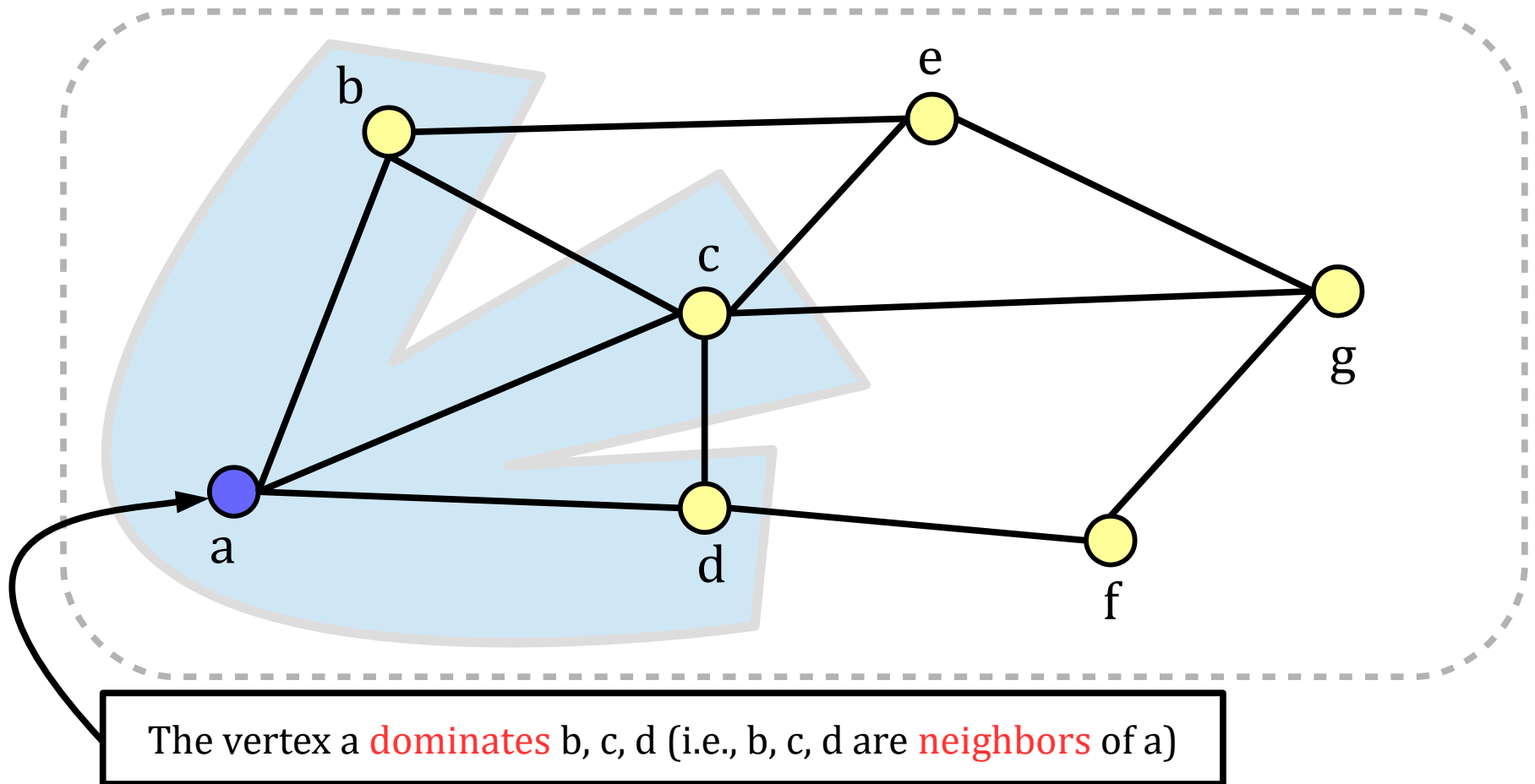
# k-Dominating Set (k-DS)

**Input:** A graph  $G=(V, E)$  and an integer  $k > 0$ .  
**Goal:** Find  $k$  vertices that **dominates** all other vertices.



# k-Dominating Set (k-DS)

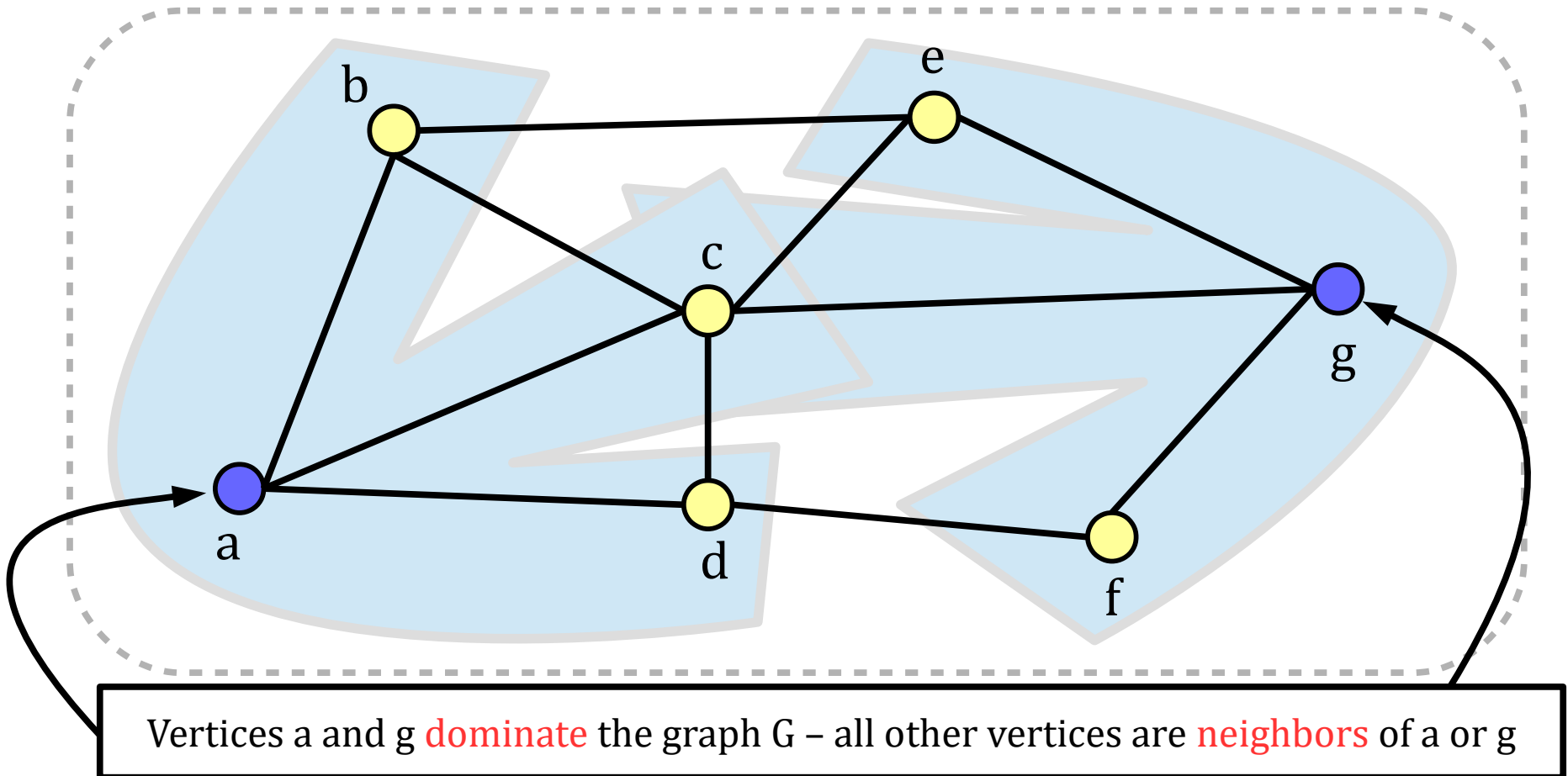
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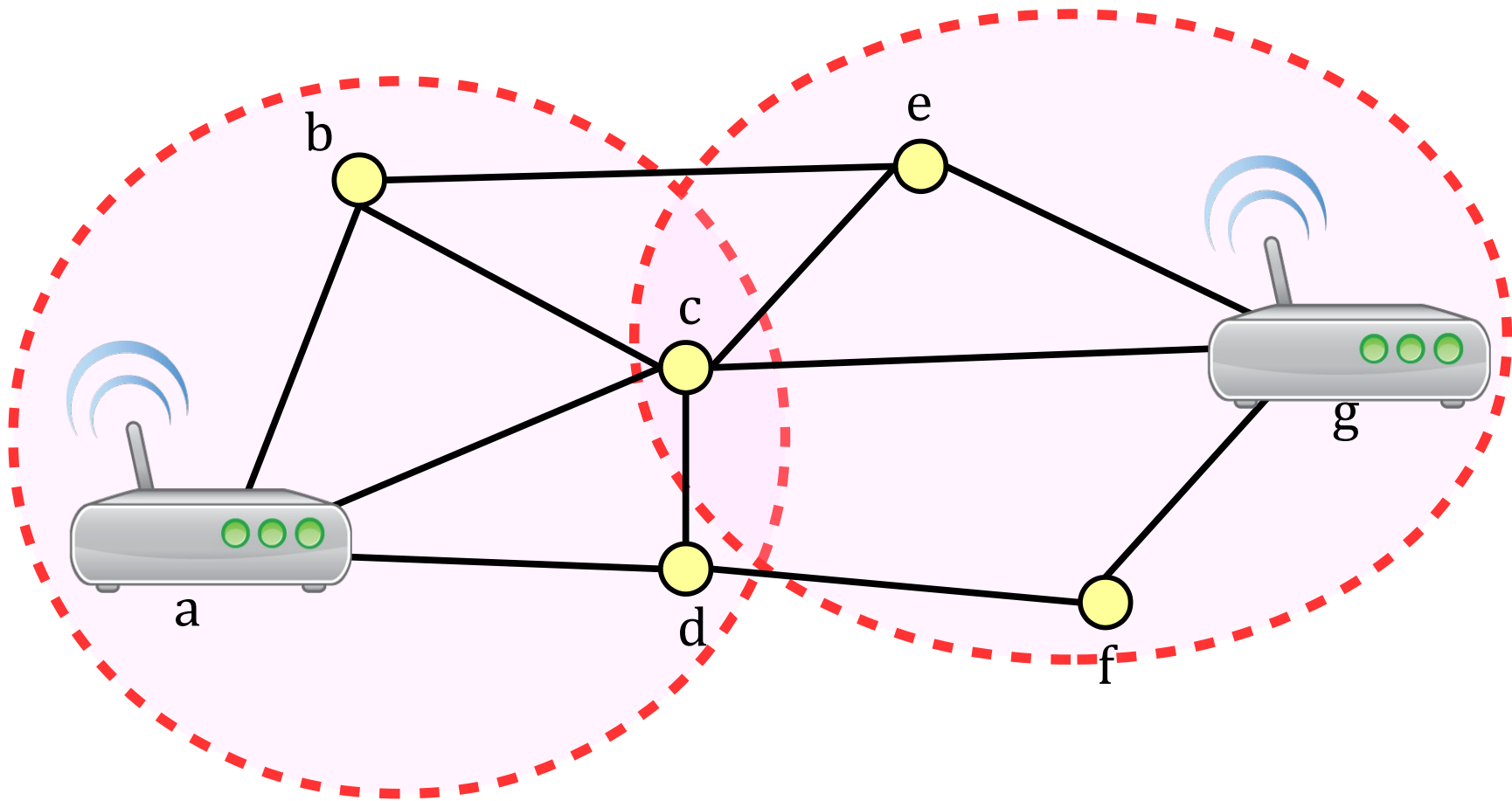
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# The Importance of Dominating Set

- **W[2]-Complete Problem**

Analogue of SAT in Parameterized Complexity

- **Fine-Grained Lower Bound**

Conjecture: No  $n^{k-1}$ -time algorithm for k-DS

# The Importance of Dominating Set

- W[2]-Complete Problem

Analogue of SAT in Parameterized Complexity

- Fine-Grained Lower Bound

Conjecture: No  $n^{k-1}$ -time algorithm for k-DS

**Inapproximability** k-DS implies **running-time** bound of approximating many problems.

# Known Algorithms

- Exact  $n^{k+o(1)}$ -time [PW'10]
- $O(\log n)$ -approx in  $O(n^3)$ -time [J74]
- $(\ln n - \ln \ln n - \Theta(1))$ -approx in  $n^{o(1)}$ -time [S96]

# Known Algorithms

- Exact  $n^{k+o(1)}$ -time [PW'10]
- $O(\log n)$ -approx in  $O(n^3)$ -time [J74]
- $(\ln n - \ln \ln n - \Theta(1))$ -approx in  $n^{o(1)}$ -time [S96]

We don't know how to find a dominating set of size  $2^k$  in time  $n^{k-1}$  even if we know that the graph has dominating set of size  $k \ll n$ .

Is there an  $O(n^{k-1})$ -time algorithm  
that gives  $O(2^k)$ -approximation?

Is there an  $O(n^{k-1})$ -time algorithm  
that gives  $O(2^k)$ -approximation?

Our answer is NO, and it is even WORSE!  
(assuming popular hypotheses)



# Our Results

Parameterized Inapproximability of  $k$ -Dominating Set

**Hypothesis**

**Inapprox**

**Running Time**

W[1]≠FPT

$\Omega(\log^{1/\text{poly}(k)} n)$

FPT-Time ( $T(k) \text{ poly}(n)$ )

ETH

$\Omega(\log^{1/\text{poly}(k)} n)$

$n^{o(k)}$

SETH

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for any  $\varepsilon > 0$

$k$ -SUM

$\Omega(\log^{1/\text{poly}(k)} n)$

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# Our Results

Parameterized Inapproximability of  $k$ -Dominating Set

Hypothesis	Inapprox	Running Time
W[1]≠FPT	$\Omega(\log^{1/\text{poly}(k)} n)$	FPT-Time ( $T(k) \text{ poly}(n)$ )
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SETH	$\Omega(\log^{1/f(k)} n)$	$n^{k-\varepsilon}$ for any $\varepsilon > 0$
$k$ -SUM	$\Omega(\log^{1/\text{poly}(k)} n)$	$n^{k/2-\varepsilon}$ for any $\varepsilon > 0$

Even  $\exp(\exp(\exp(k)))$ -Approx in  $(n^{k-0.1})$ -Time is unlikely!

# Our Results

Parameterized Inapproximability of  $k$ -Dominating Set

**Hypothesis**

**Inapprox**

**Running Time**

<del>W[1] ≠ FPT</del>	$\Omega(\log^{1/\text{poly}(k)} n)$	FPT-Time ( $T(k) \text{ poly}(n)$ )
<del>ETH</del>	$\Omega(\log^{1/\text{poly}(k)} n)$	$n^{o(k)}$
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<del>k-SUM</del>	$\Omega(\log^{1/\text{poly}(k)} n)$	<del><math>n^{k/2-\varepsilon}</math></del> for any $\varepsilon > 0$

Hardness of these forms (i.e.,  $\Omega(\log^{1/k} n)$ -inapprox in  $n^{o(k)}$ -time) were known only under **Gap-ETH**. [CCKLMNT, FOCS'17]

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Parameterized Inapproximability via Communication Complexity

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We extend their works to the area of Parameterized Inapproximability.

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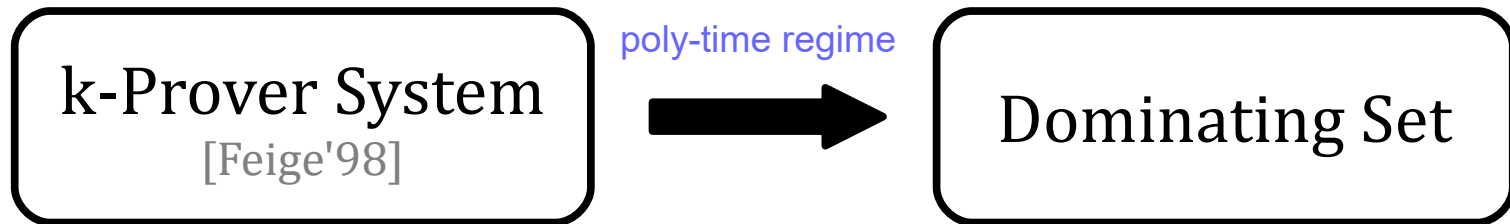
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(Precisely, the variant of Label Cover defined in [CCKLMNT'17], namely Max-Cover.)

We devise communication protocols for problems  
corresponding to the popular hypotheses  
FPT $\neq$ W[1], ETH, SETH, k-SUM.

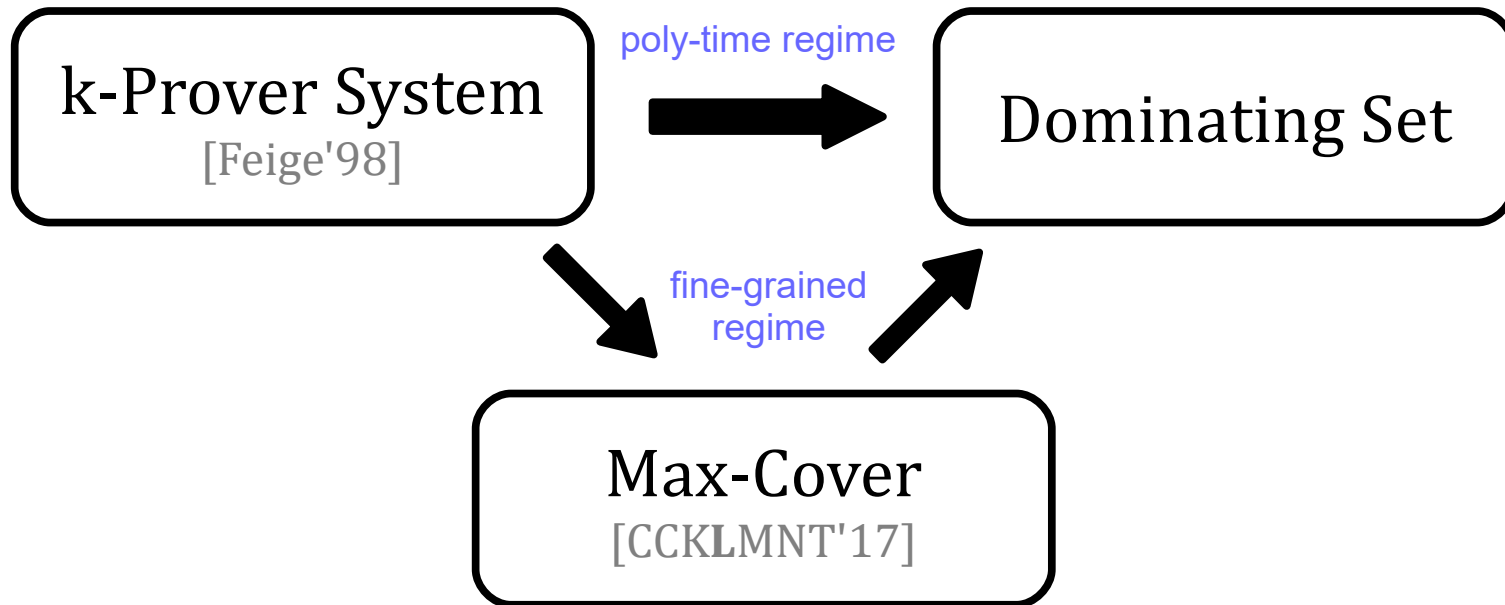
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# k-DS & Communication Protocols

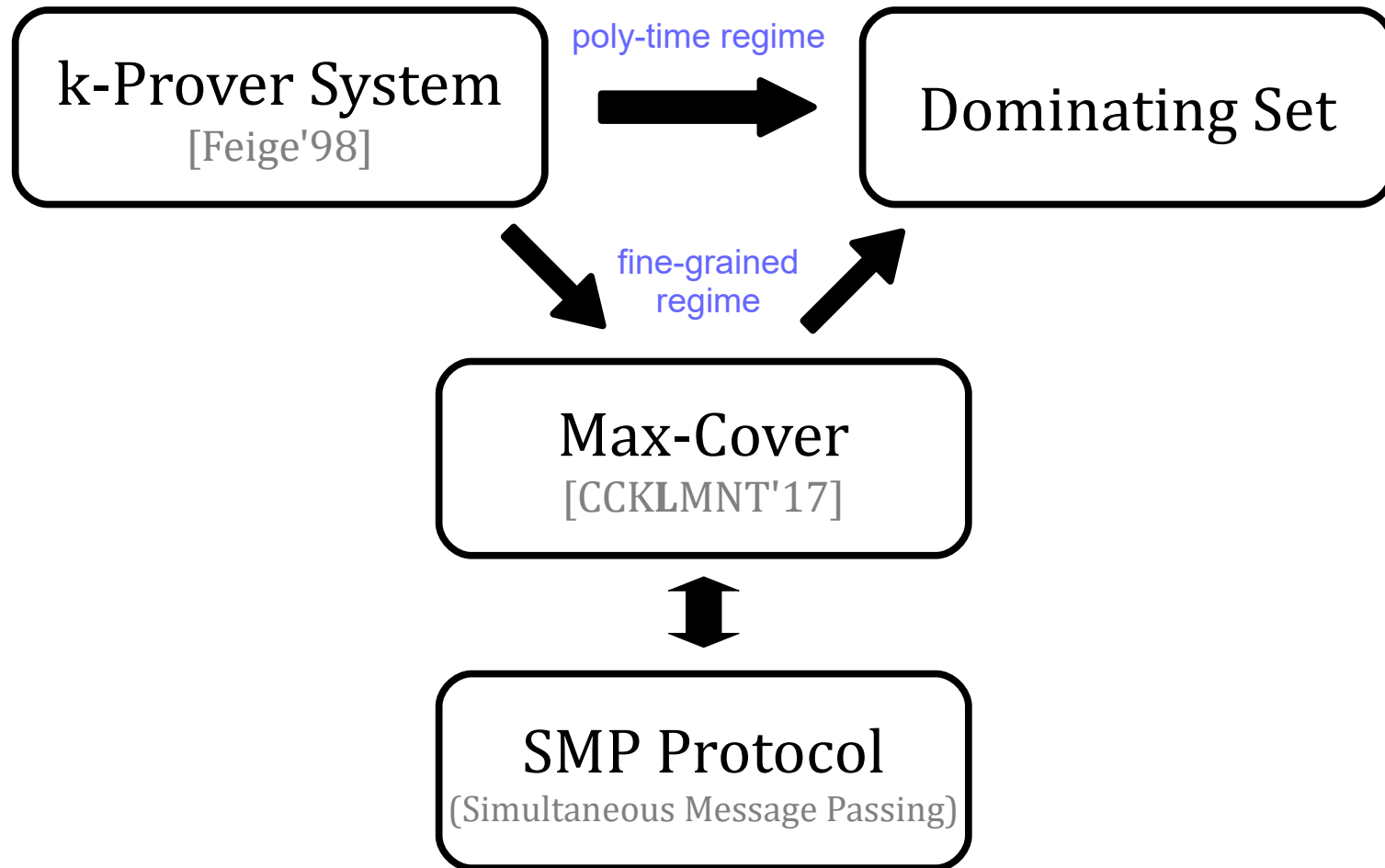




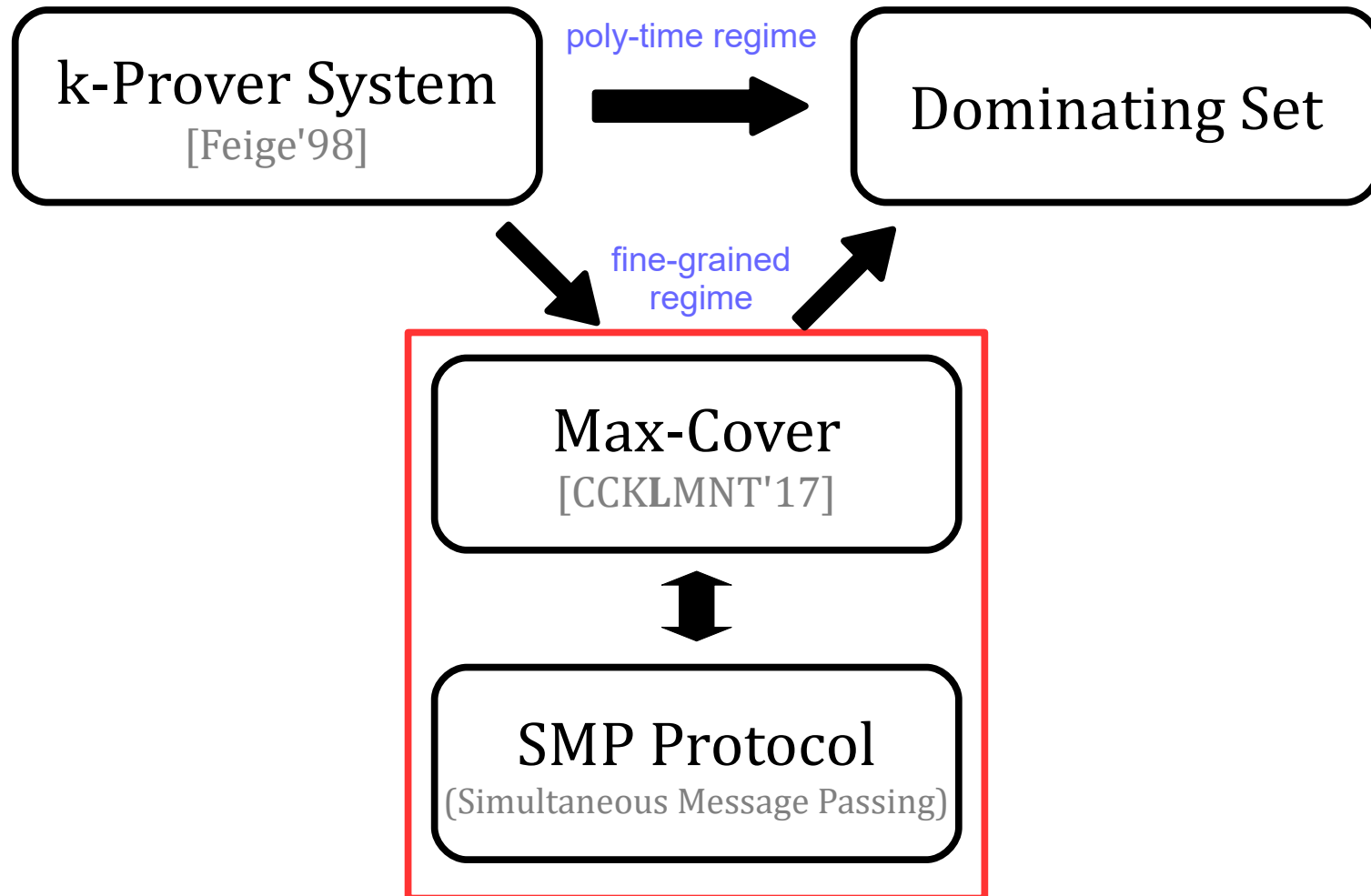
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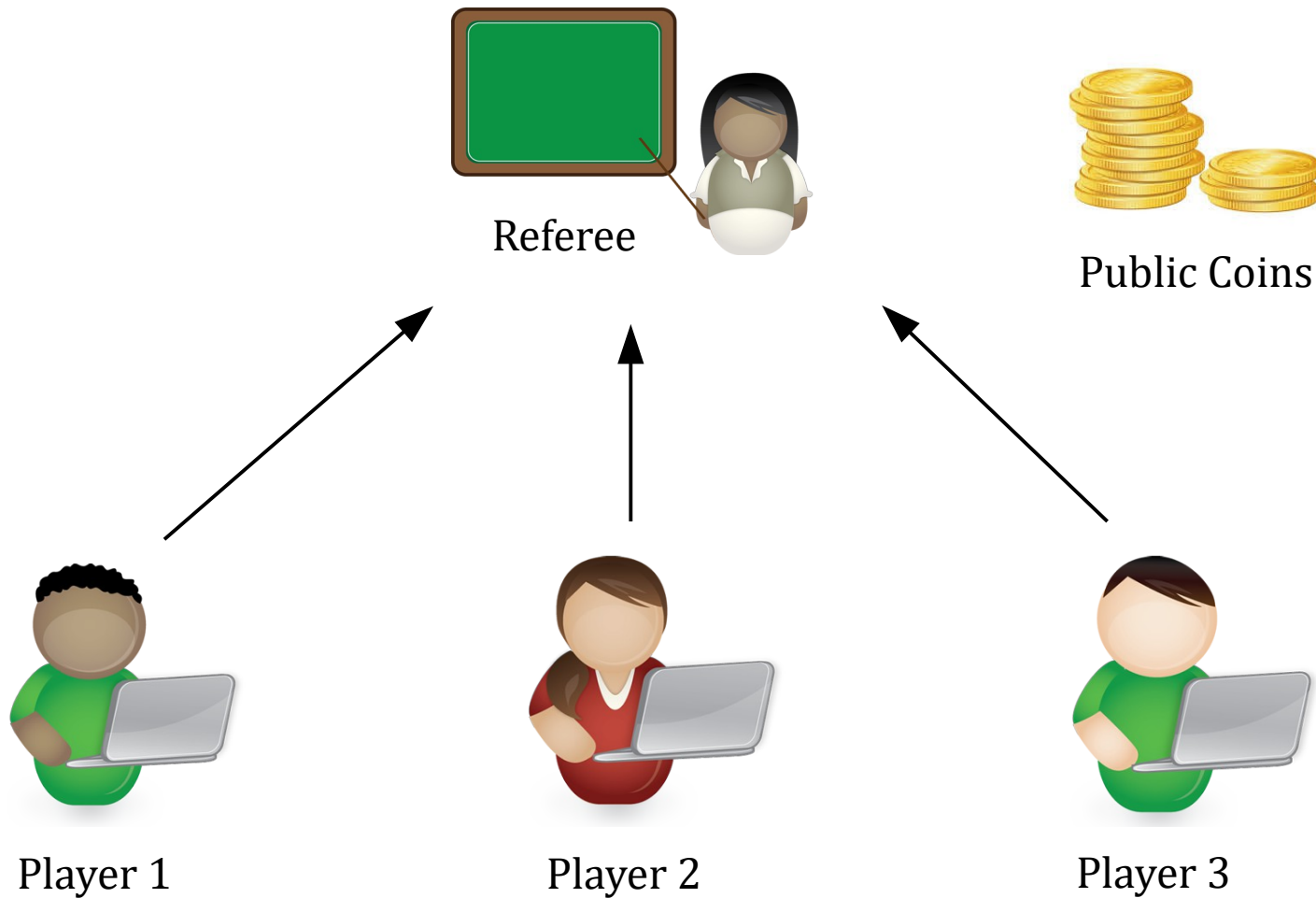
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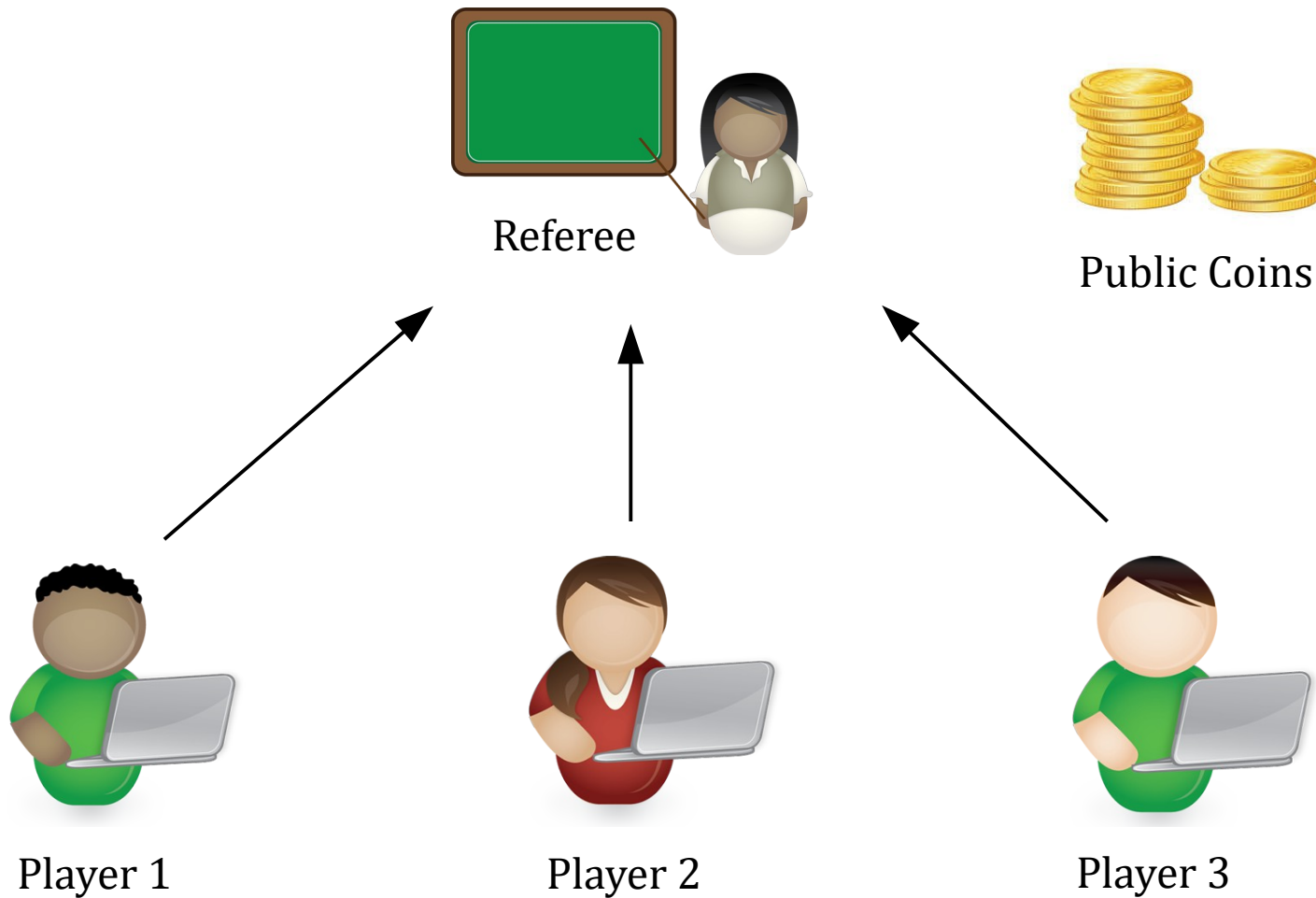
# k-DS & Communication Protocols



# Single Message Passing Protocol

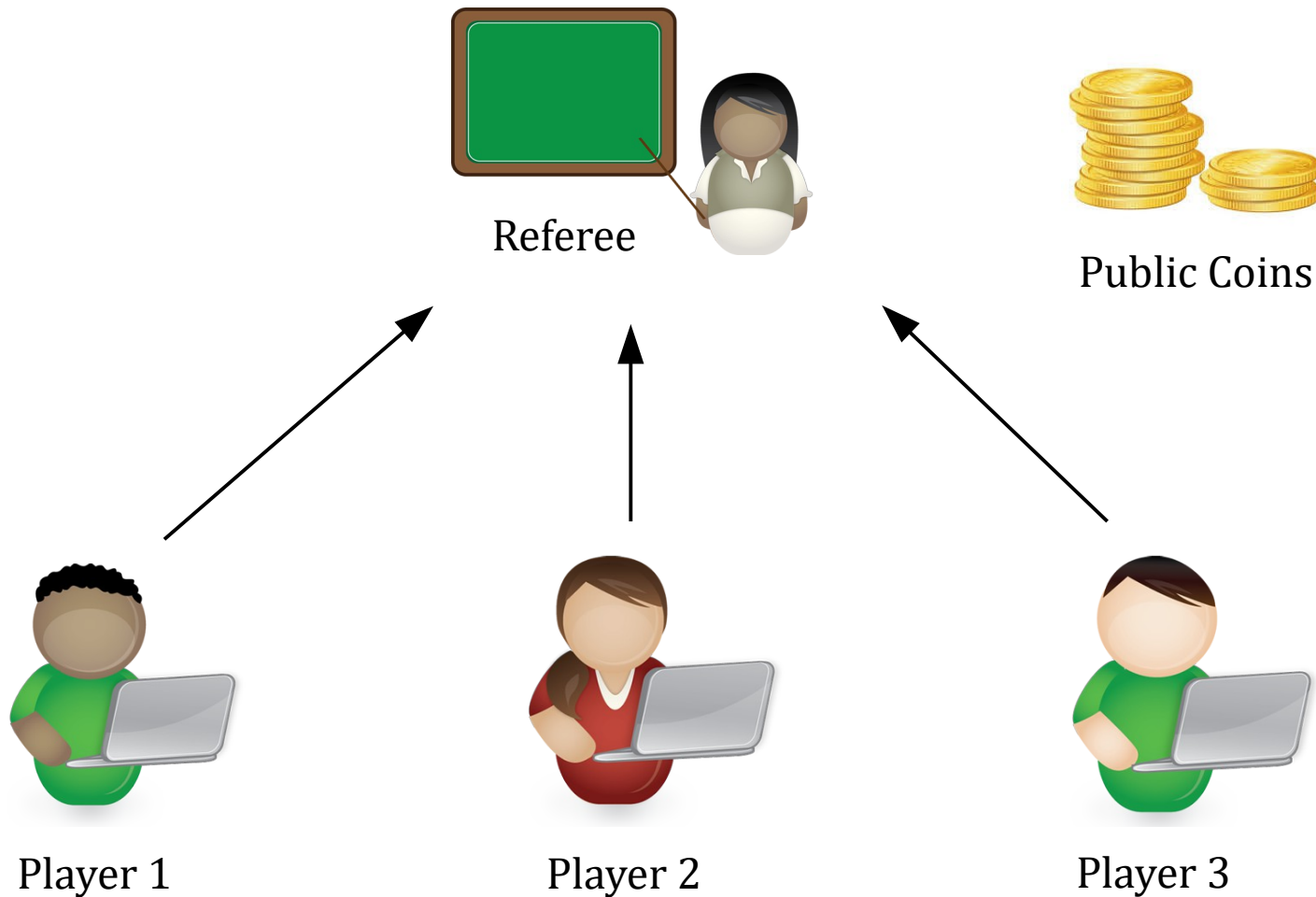


# Single Message Passing Protocol



The goal is to use the **smallest** communication bits.

# Single Message Passing Protocol



For our purpose, we want to use  $\leq O(1)$  bits.

# Known SMP Protocols

that captures popular conjectures

## Hypothesis

W[1]≠FPT

ETH

SETH

k-SUM

## Protocols

Agreement

Set Disjointness

Set Disjointness

Sum-Zero

## Running Time

FPT-Time ( $T(k)$  poly( $n$ ))

$n^{o(k)}$

$n^{k-\varepsilon}$  for any  $\varepsilon > 0$

$n^{k/2-\varepsilon}$  for any  $\varepsilon > 0$

All protocols give inapprox ratio  $\Omega(\log n)^{1/\text{poly}(k)}$

# Popular Hypotheses

- **ETH:** SAT has no  $2^{o(n)}$ -time algorithm.
- **SETH:** SAT has no  $2^{(1-\varepsilon)n}$ -time algorithm.
- **k-SUM:** Find  $k$  integers from  $S \subseteq [-n^2, n^2]$  that sum to zero requires  $n^{k/2-\varepsilon}$ -time.
- **FPT  $\neq$  W[1]:**  $k$ -DS has no  $T(k)$   $\text{poly}(n)$ -time algorithm.



# FPT $\neq$ W[1] Hypothesis

NP-hardness-like assumption in Parameterized Complexity

“k-Clique has no  $T(k) \text{ poly}(n)$  time algorithm.”

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**FPT** is a class of problems that have  $T(k) \text{ poly}(n)$  time (i.e., FPT) algorithms.

**W[1]-complete** is a class of problems that have **no known FPT algorithm**.

It is known that **FPT**  $\subseteq$  **W[1]**, but the converse is believed to be false.

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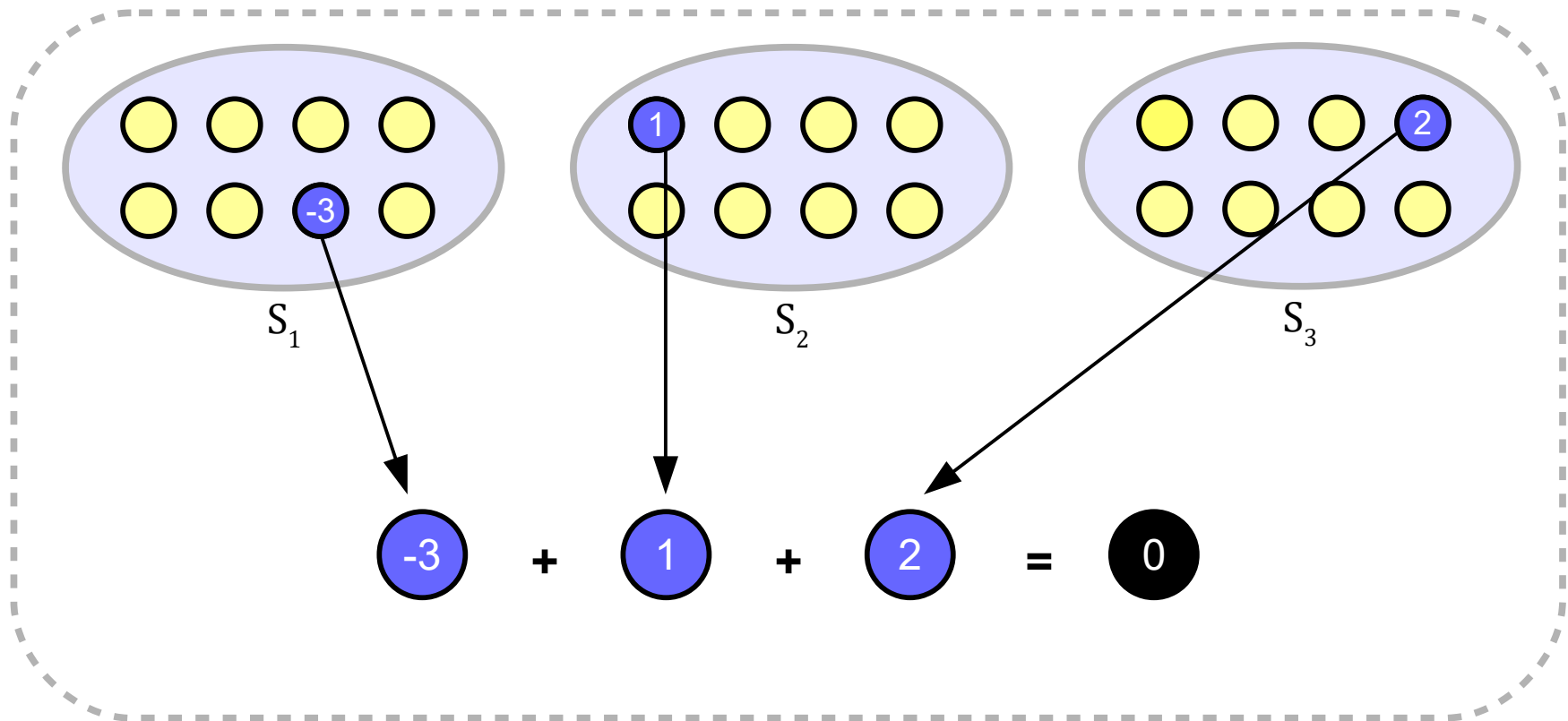
SMP-Protocol  $\leftrightarrow$  ~~Max-Cover~~  $\rightarrow$  k-DS  
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We will **skip** the formal definition of the **Simultaneous Messages Passing** protocol.

# k-SUM (multi-set version)

**Input:**  $k$  collections of Integers  $S_1, \dots, S_k$ .

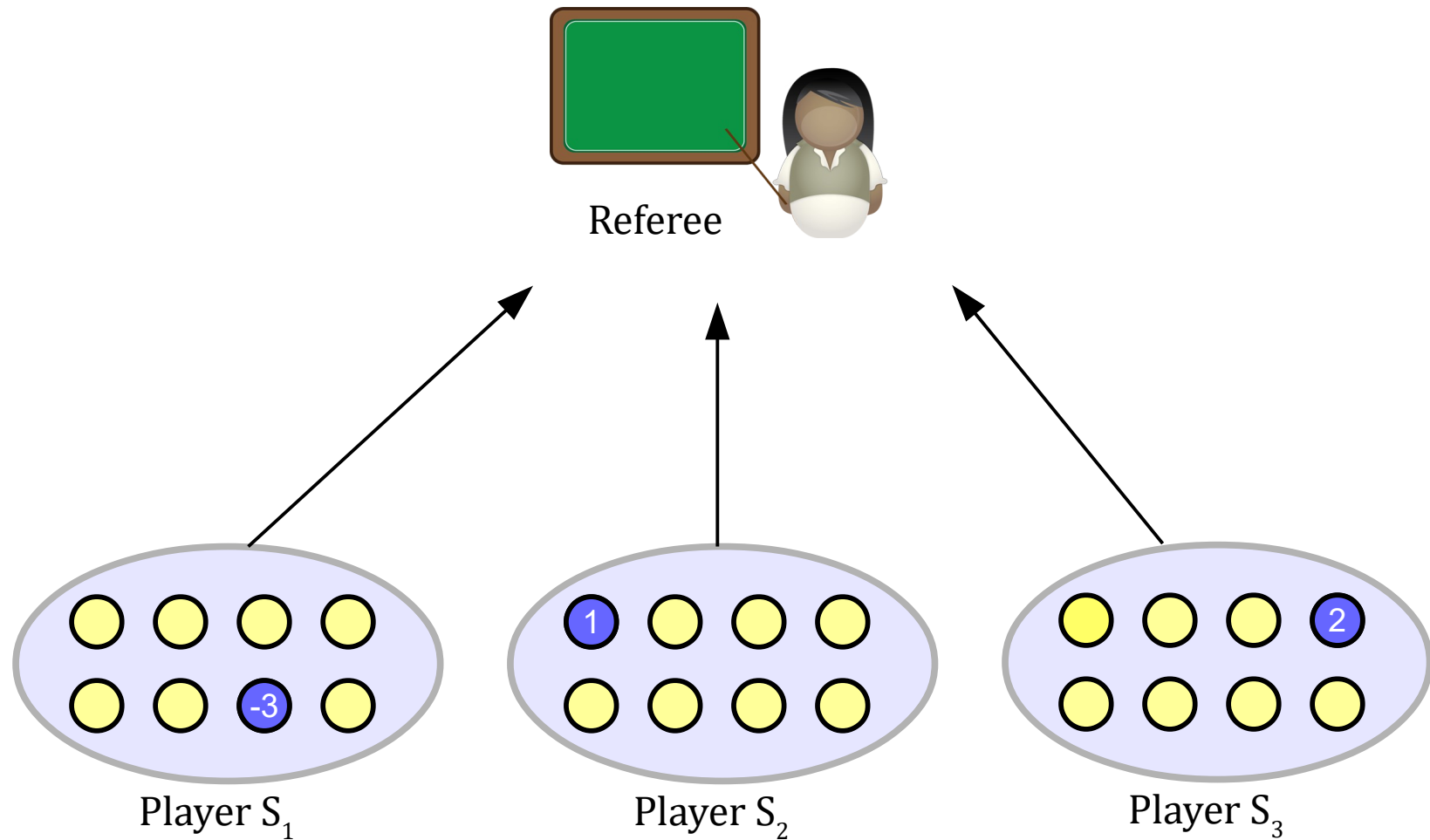
**Goal:** find  $k$  integers  $a_1 \in S_1, \dots, a_k \in S_k$  s.t.  $a_1 + \dots + a_k = 0$ .





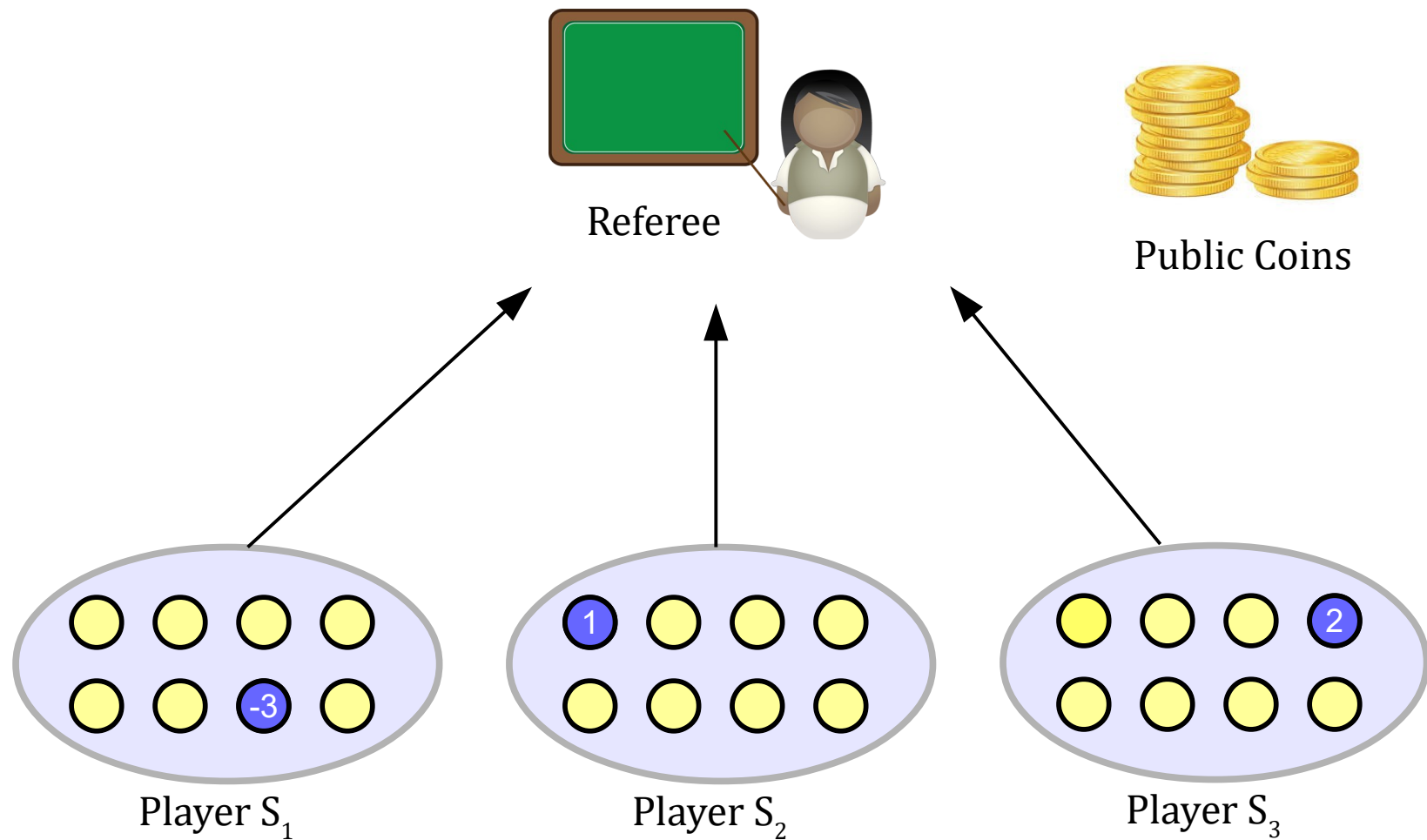
Now we devise a protocol for **k-SUM**.  
Let 's assume that each play has one  
**number** (presumably given by k-SUM algorithm).

# Protocol for k-SUM (Sum-Zero Protocol)



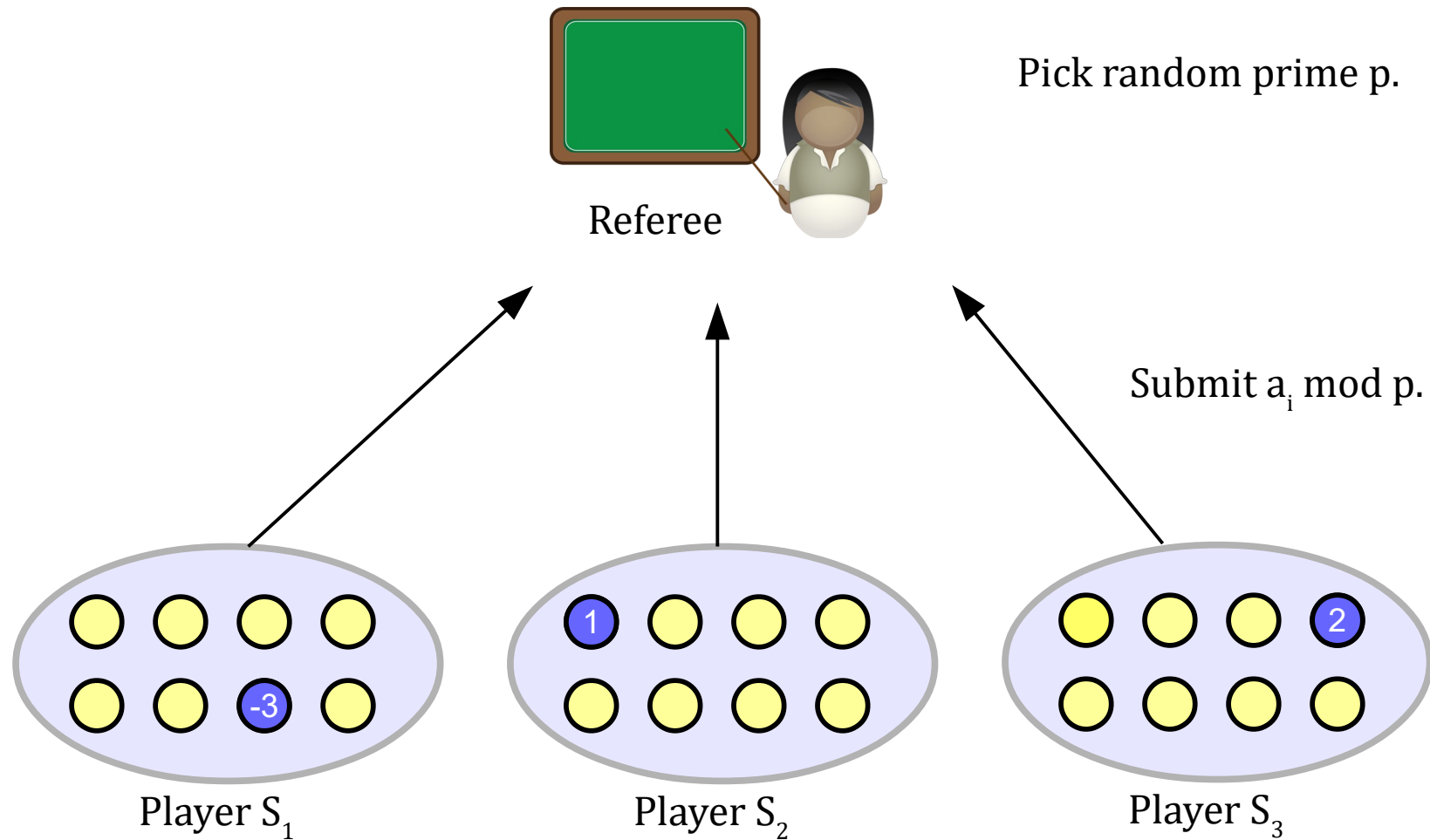
Each player has one **number-in-hand** (presumably, given by a k-SUM algorithm).  
And they, **honestly**, want to decide if these numbers **sum to zero**.

# Protocol for $k$ -SUM (Sum-Zero Protocol)



The referee may use **randomness** to reduce the communication bits.

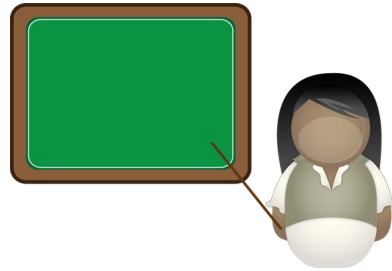
# Protocol for k-SUM (Sum-Zero Protocol)



$$a_1 + a_2 + a_3 = 0 \rightarrow (a_1 \bmod p) + (a_2 \bmod p) + (a_3 \bmod p) = 0$$

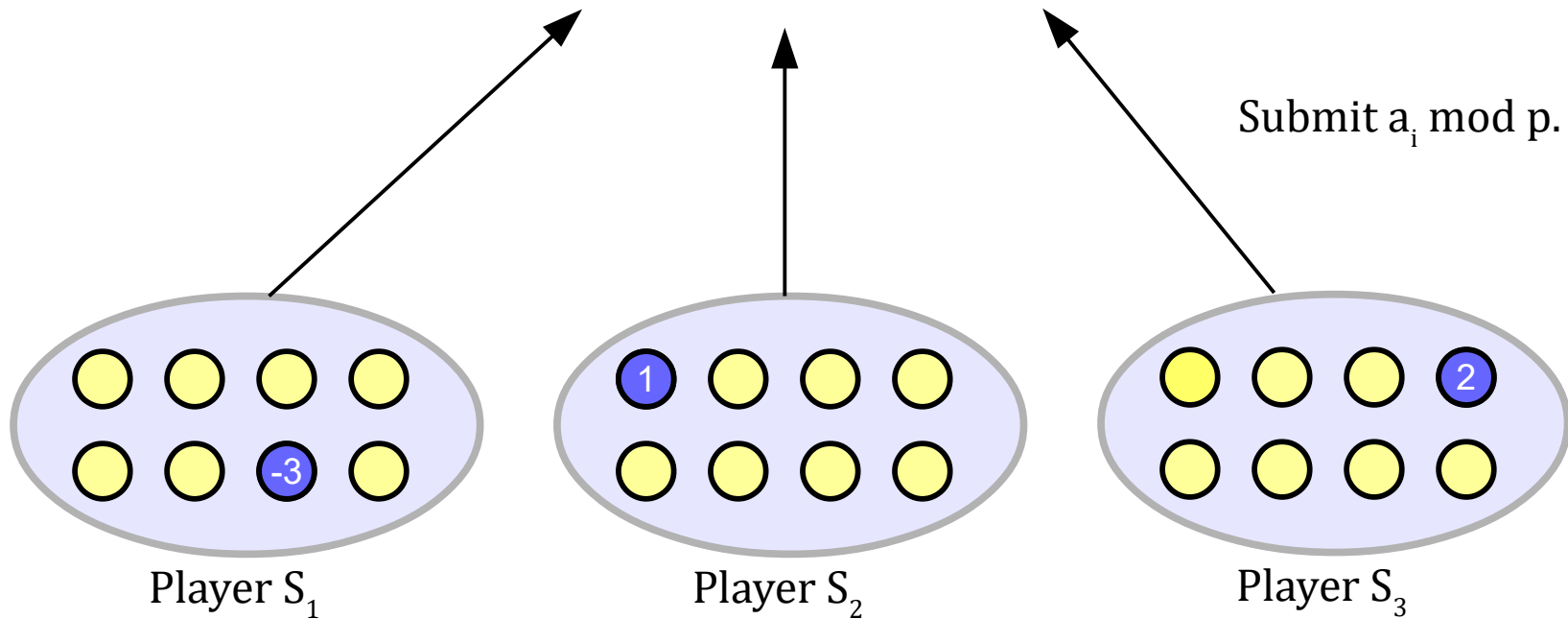
# Protocol for k-SUM (Sum-Zero Protocol)

**NOTE:** Too large random bits.  
To get the desired parameters,  
we combine [Nisan93] & [Viola15]



Pick random prime  $p$ .

Submit  $a_i \bmod p$ .

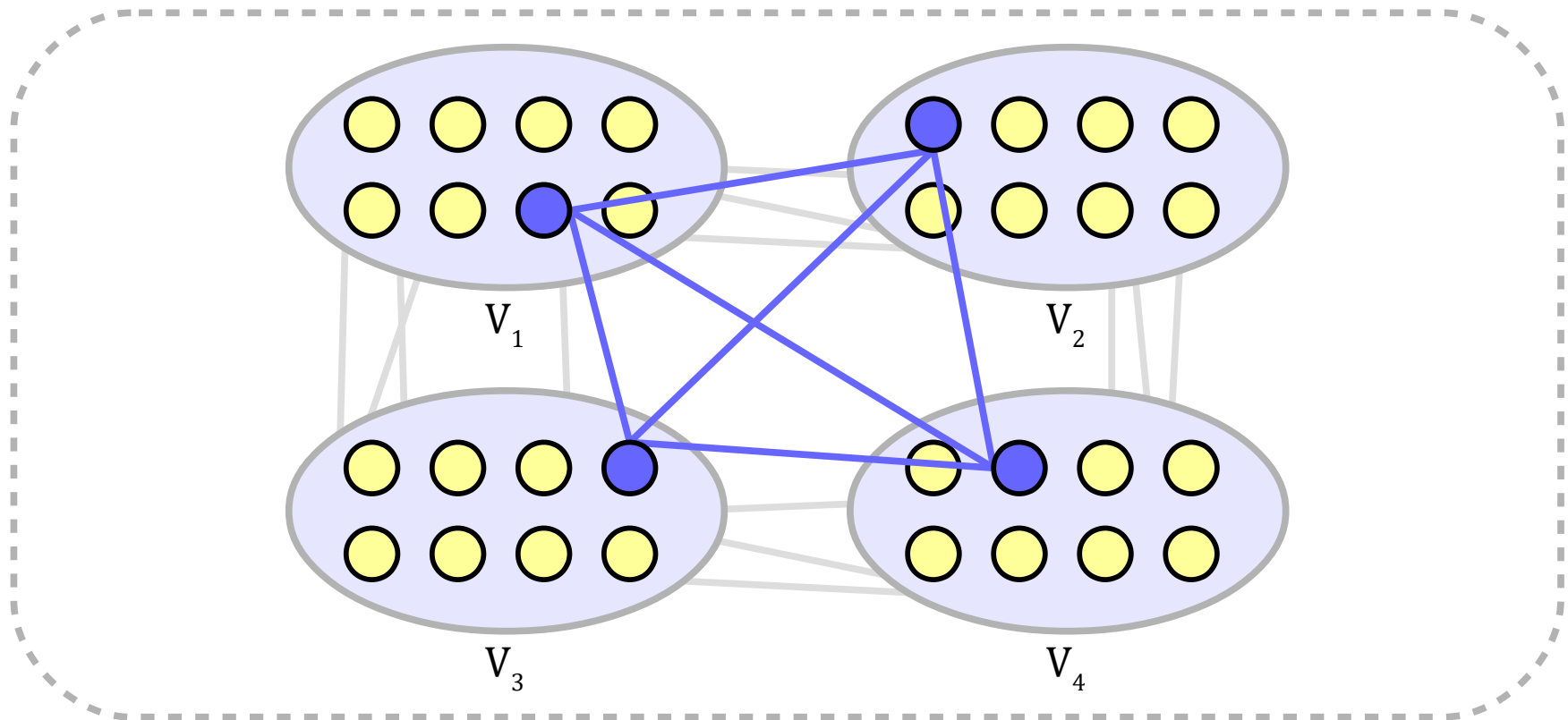


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# k-Clique (multi-color version)

**Input:** a bipartite graph  $G = (V, E)$ , a  $k$ -partition of  $V = V_1 \cup \dots \cup V_k$

**Goal:** find a subset of vertices  $S \subseteq V(G)$ , one from each  $V_i$  s.t.  $G[S]$  is a clique.

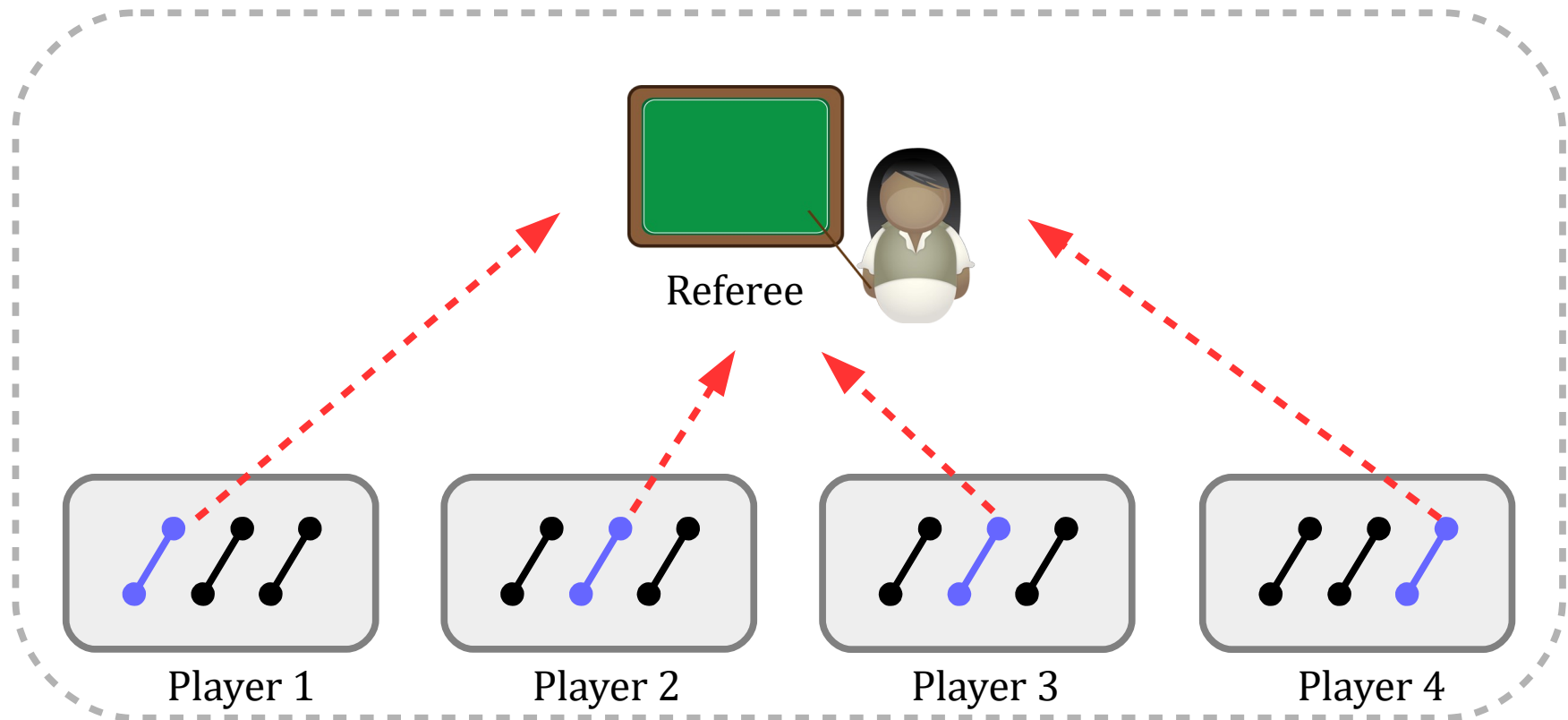


# Protocol for k-Clique

(Edge-Vertex Incident Game)

**Players:**  $O(k^2)$   $\{i,j\}$ -players, each submits one edge between  $V_i$  to  $V_j$ .

**Referee:** Check if there exists  $k$  vertices (one from each  $V_i$ ) such that each vertex is incident to  $k-1$  submitted edges.

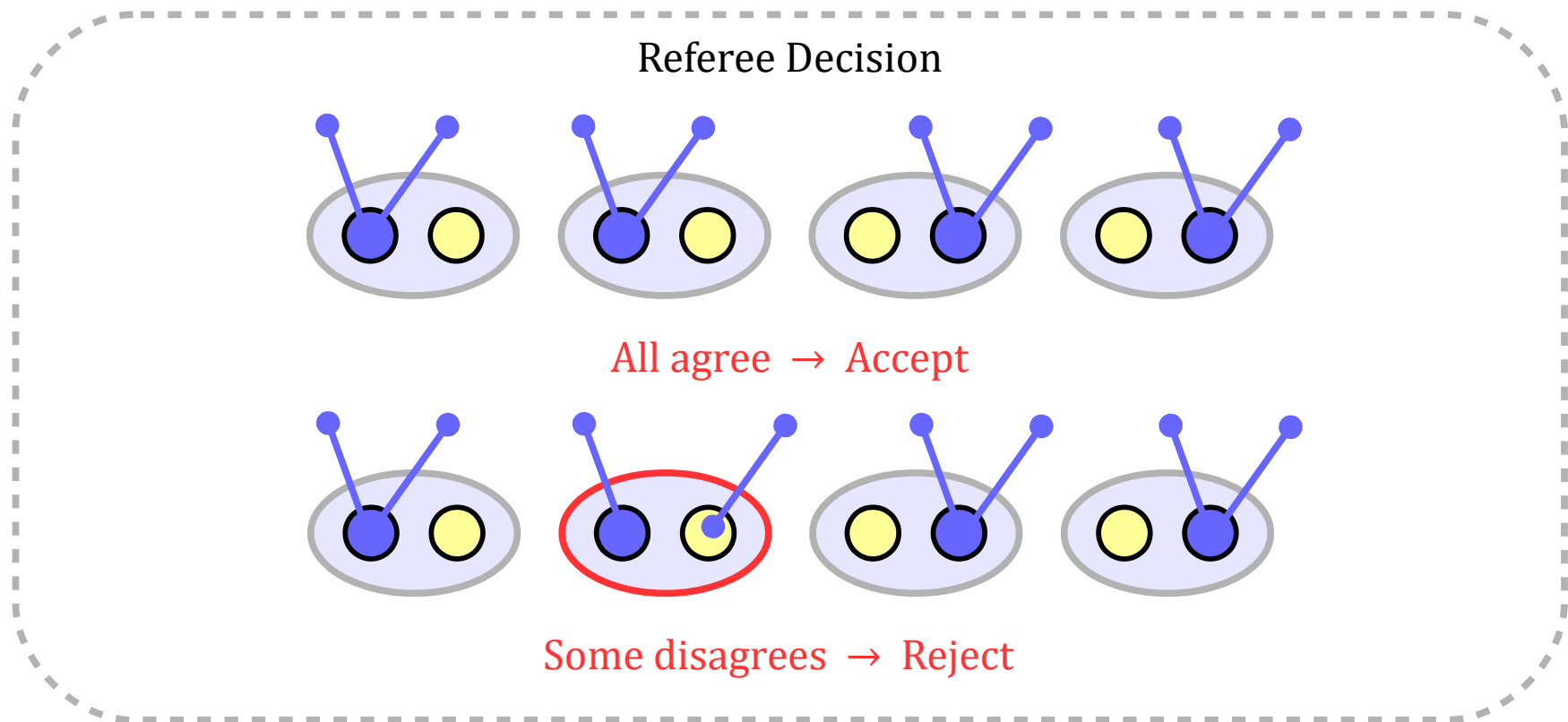


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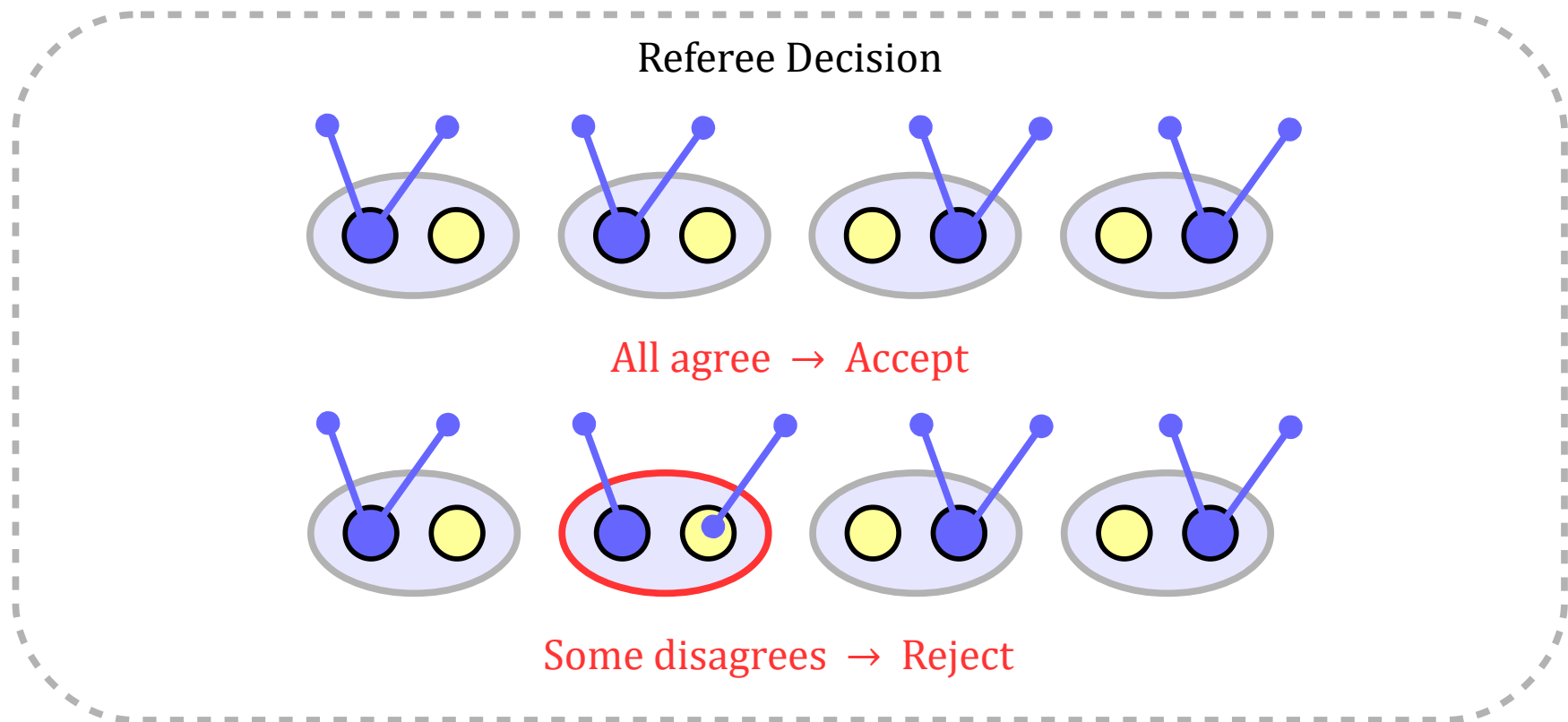


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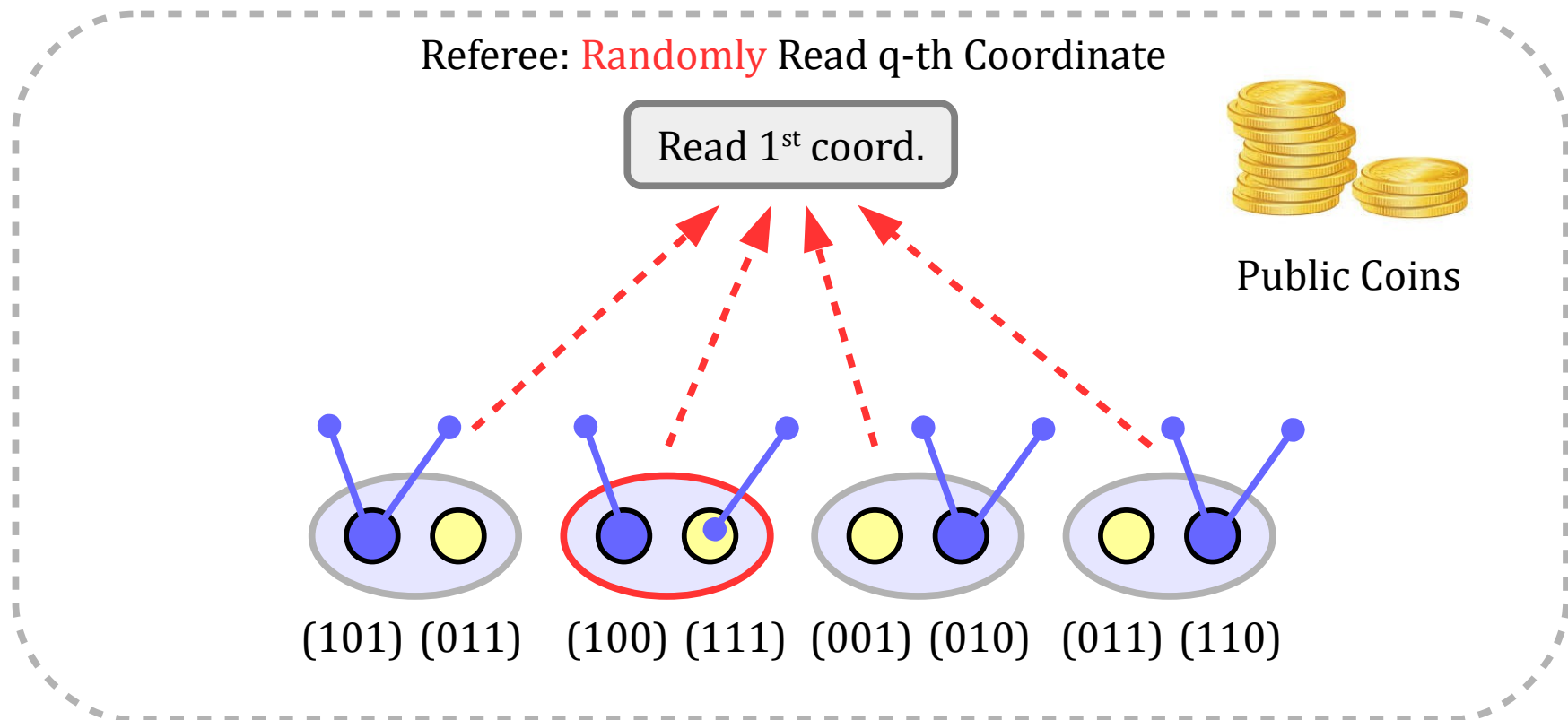


Use **Error Correcting Codes** to reduce communications.

# Revised Protocol for k-Clique

(Encode Vertices Using Good Codes)

- Codes:** Each vertex is encoded with random codes from  $[2]^{\log n}$
- Players:**  $(i, j)$  is asked to submit **encoded-endpoints** of edge  $V_i - V_j$ .
- Referee:** Random an index  $q$ . Then check if  $q$ -th char of  **$k-1$  encoded-edges** are consistent.

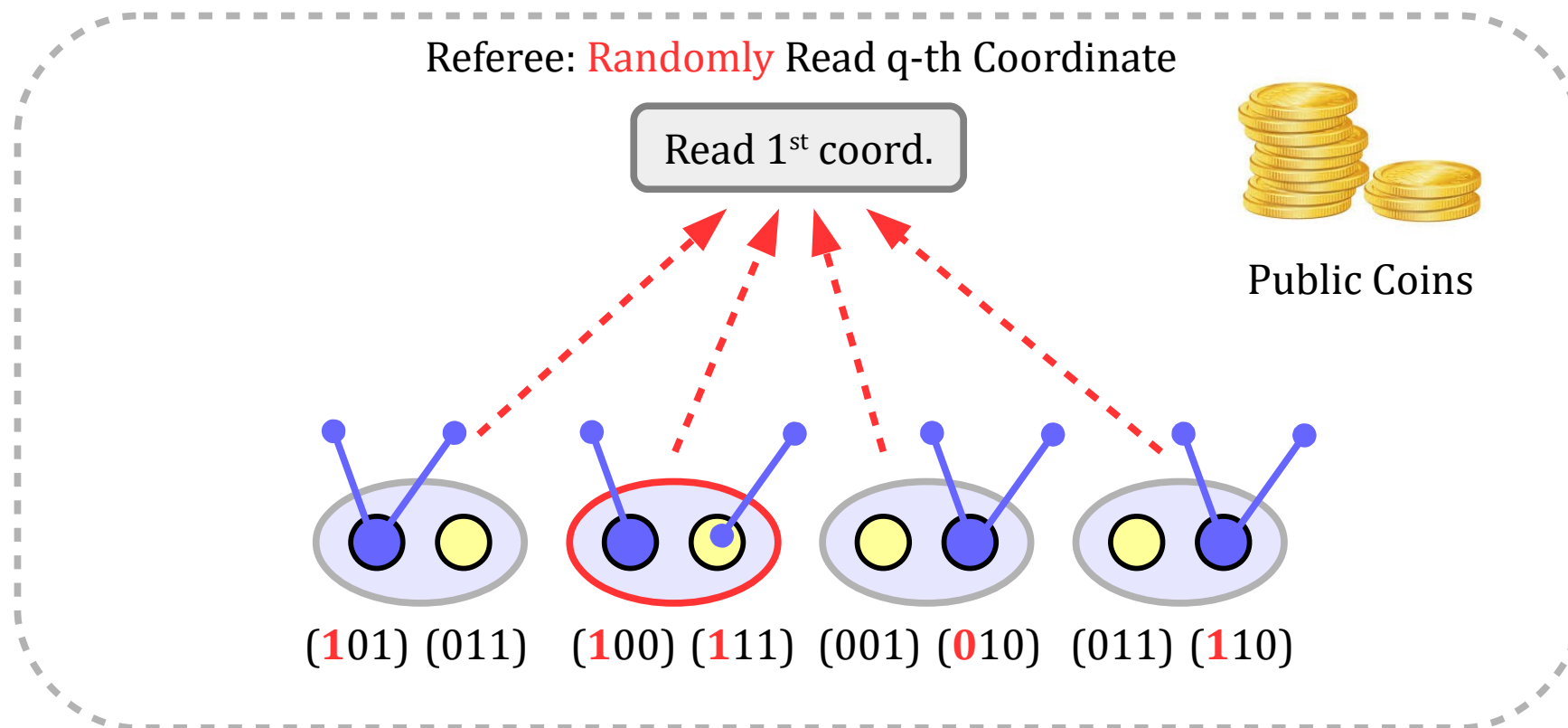


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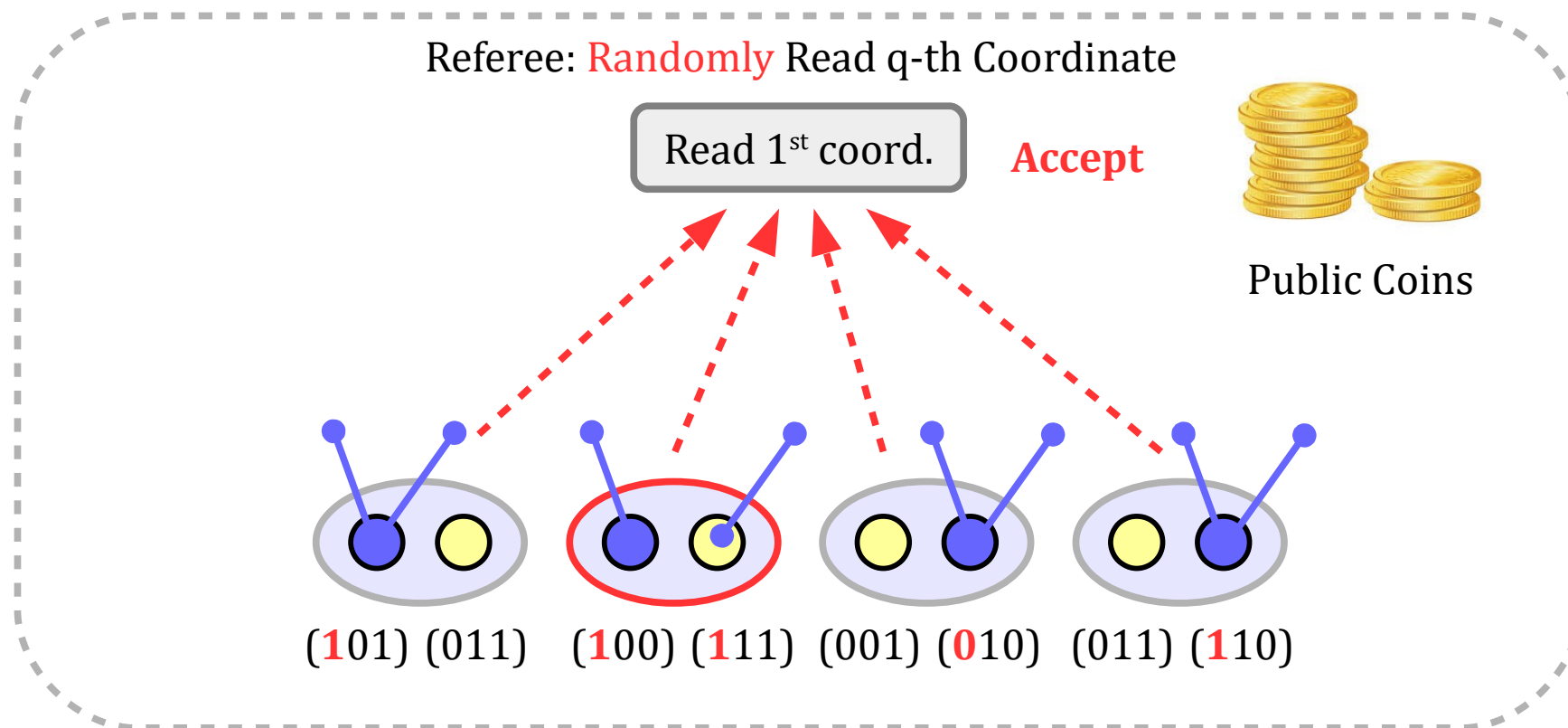


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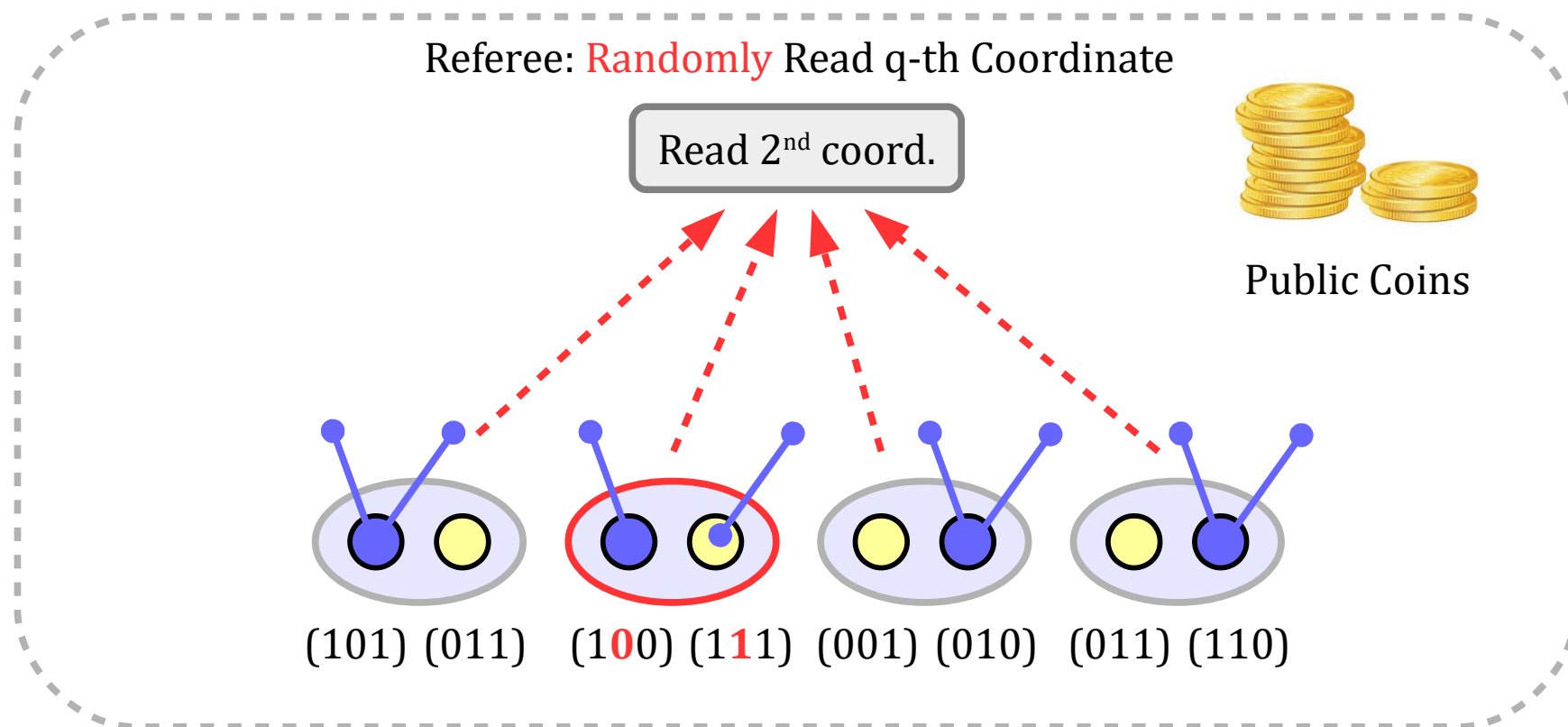


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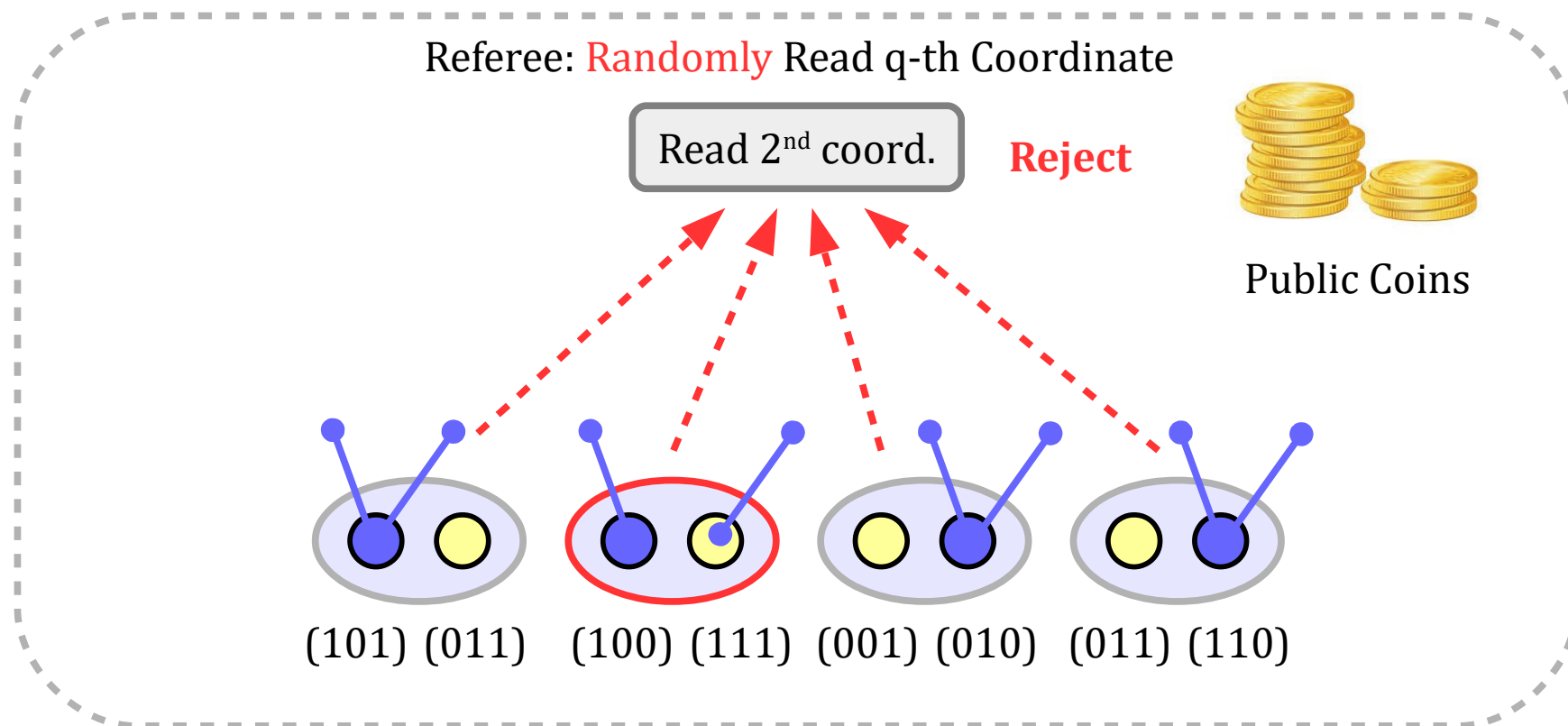


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# Conclusion

- Parameterized Inapproximability of  $k$ -DS under  $\text{FPT} \neq \text{W}[1]$ , ETH, SETH,  $k$ -SUM.
- Connection between Communication Complexity and Parameterized Inapproximability.  
[SMP-Protocol  $\rightarrow$  Max-Cover  $\rightarrow$   $k$ -DS]

# Conclusion

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- Connection between Communication Complexity and Parameterized Inapproximability.  
[SMP-Protocol  $\rightarrow$  Max-Cover  $\rightarrow$  k-DS]

Recently, [Bingkai Lin](#) gives an alternate proof of our results. His technique is **simpler** but **is not captured** by our framework.



# Open Problems

- Prove  $k$ -DS inapprox under  $FPT \neq W[2]$ 
  - $k$ -DS is known to be  $W[2]$ -complete.
  - Is it possible that it is  $W[2]$ -hard even to approximate  $k$ -DS?
- Bypassing Gap-ETH for  $k$ -Clique
  - FPT-inapprox for  $k$ -Clique has been shown under  $Gap$ -ETH.
  - Is it possible to base the FPT-inapprox for  $k$ -Clique under ETH, SETH or  $W[1] \neq FPT$ ?

# The End

(the real end of this talk)

Thank you for your attention.

Questions?