



# Playing Dominoes Is Hard, Except by Yourself

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## Why should I care?

- Winning strategy: complexity
- Useful for reductions
- Reduction from instances of job scheduling problem <sup>1</sup>

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<sup>1</sup>two-machine no-idle/no-wait shop scheduling [BDCST19]

## Domino Game: Classical Version

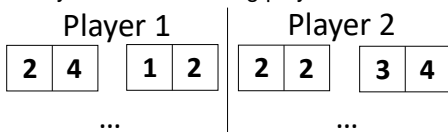
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## Domino Game: Classical Version

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- Evenly distributed among players

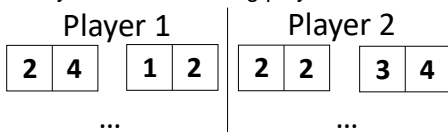
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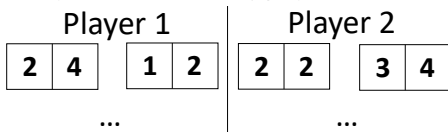
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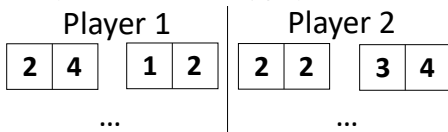
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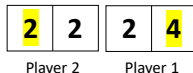
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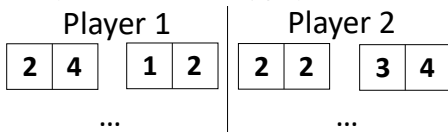
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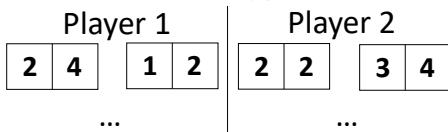


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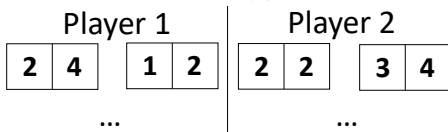


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- Winner:
  - Player, first out of dominoes
  - Opponent stuck

## Domino Game: Generalized Version

Instance of Domino Game:

- multiset of  $n$  dominoes
- arbitrary distribution among players

Winner:

- Rid of all dominoes
- Opponent stuck

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Goal

Complexity to decide: Given a Dominoes instance, does a winning strategy exist?

## Variants of Dominoes

### Cooperative Dominoes

$p\text{-COOP-DOM} = \{ \langle \text{Instance of Dominoes} \rangle \mid \text{All players can help P1 win the game} \}$

- $p \geq 1$  players
- Can all players help Player 1 win the game?

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Perfect information: all dominoes visible

Player 1 starts.



## We will show

1. One-player dominoes is in P
2. Two-player cooperative dominoes is NP-complete
3. Two-player competitive dominoes is PSPACE-complete
4. (p-player cooperative dominoes is NP-complete)
5. (p-player competitive dominoes is PSPACE-complete)

## Theorem

*One-player dominoes*  $\in P$

Proof.

One-player dominoes  $\leq_p$  Eulerian Path<sup>1</sup>

Numbers on dominoes  $\rightarrow$  Vertices

Dominoes  $\rightarrow$  Edges

1	2
2	3
3	2
2	2
2	4



Eulerian path<sup>1</sup> exists in  $G \iff$  valid domino chain exists

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<sup>1</sup> allowing for revisiting vertices

# Cooperative Dominoes

2 players; can all players help Player 1 win the game?

## Theorem

*2-player cooperative dominoes (2P-COOP-DOM) is NP-complete.*

Proof.

1) 2P-COOP-DOM  $\in$  NP:

Given a move sequence, verify whether Player 1 wins.

2) 2P-COOP-DOM is NP-hard:

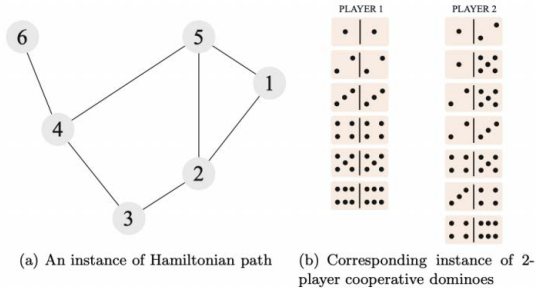
Reduction from Hamilton Path Problem (HP)



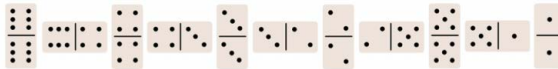
$$HP \leq_p 2P\text{-}COOP\text{-}DOM$$

Given (connected) graph  $G = (V, E)$ , construct dominoes instance:

$$T_1 = \{\{i, i\} \mid i \in V\} \text{ and } T_2 = \{\{i, j\} \mid (i, j) \in E\} \cup \{\{*, *\}\}$$



**Fig. 1.** Reduction from Hamiltonian path to 2-player cooperative dominoes



**Fig. 2.** Hamiltonian path represented as domino chain

## Edge Case

$$T_1 = \{\{i, i\} \mid i \in V\} \text{ and } T_2 = \{\{i, j\} \mid (i, j) \in E\} \cup \{\{*, *\}\}$$



Player 1				Player 2	
1	1	2	2	1	2

$G$  is connected so there are at least  $|V| - 1$  edges  $\Rightarrow$  Player 2 cannot get rid of his dominoes before Player 1 with dummy domino

# Competitive Dominoes

2 players; does player 1 have a winning strategy?

## Theorem

*2-player competitive dominoes (2P-COMP-DOM) is in PSPACE.*

Proof.

Convert into instance of the Formula Game Problem



# Formula Game

Given quantified Boolean formula in prenex normal form

$$\phi = \exists x_1 \forall x_2 \exists x_3 \forall x_4 \dots Q x_k [\psi]$$

and two Players E, A

Definition (Formula Game (associated with  $\phi$ ))

Player E ( $\exists$ ) and Player A ( $\forall$ ) take turns selecting variables  $x_1, \dots, x_k$

If  $\psi$  evaluates to *TRUE*, E wins. Else, A Wins.



# Formula Game

$FORMULA-GAME = \{ \langle \phi \rangle \mid \text{Player E has a winning strategy in the} \\ \text{formula game associated with } \phi \}$

## Example

$$\exists x_1 \forall x_2 \exists x_3 [(x_1 \vee x_2) \wedge (x_2 \vee x_3) \wedge (\bar{x}_2 \vee \bar{x}_3)]$$

Player E has a winning strategy: Set  $x_1 = 1$  and  $x_3 = \neg x_2$

# Formula Game

## Theorem

*FORMULA-GAME is in PSPACE*

Proof (Sketch).

Recursively check for all variables if subformula has a winning strategy by trying out all assignments. Only needs to save one possible assignment at a time.<sup>1</sup>  $\square$

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<sup>1</sup>  $\in$  PSPACE proven by Sipser via QBF [Sip97]

$2P\text{-}COMP\text{-}DOM \leq_p FORMULA\text{-}GAME$

Every instance of dominoes can be transformed into a formula game problem in PSPACE.

Define variables  $X_{i,j,k,l}$  representing  $i$ -th domino, placed in  $j$ -th direction, at  $k$ -th position at the  $l$ -th turn ( $\mathcal{O}(n^3)$  many variables).

- Generate  $\psi = (F_1 \wedge F_2 \wedge F_3) \vee \neg F_4$  which is satisfied iff Player 1 wins a valid game OR if Player 2 makes a wrong move.  
 F1: Satisfied iff Player 1 moves correctly.  
 F2: Satisfied iff domino chain is correct.  
 F3: Satisfied iff Player 1 won.  
 F4: Satisfied iff Player 2 moves correctly.
- Generate  $\phi = \exists X_{\_,\_,\_,1} \forall X_{\_,\_,\_,2} \dots QX_{\_,\_,\_,n} [\psi]$

# Formula Game: example

Player 1				Player 2	
1	1	1	2	2	3



## Polynomial Space?

- All constraints/checks in  $\phi$  consist of one variable or a pair of variables
- $\mathcal{O}(n^3)$  many variables  $\Rightarrow \binom{n^3}{2}$  many possible pairs  $\Rightarrow \psi$  is at most of length  $\mathcal{O}(n^6)$
- We can write the formula down in polynomial space

# PSPACE completeness

## Theorem

*2-player competitive dominoes is PSPACE-complete*

To show:

∈ PSPACE: Lemma 4

hardness: This section

## PSPACE hardness

### Theorem

*2-player competitive dominoes (2P-COMP-DOM) is PSPACE-hard*

$$\text{BIPARTITE-GG} \leq_p \text{2P-COMP-DOM} \quad (1)$$

---

<sup>1</sup>Bipart-GG: PSPACE hardness proven by Lichtenstein & Sipser via QBF [LS80]



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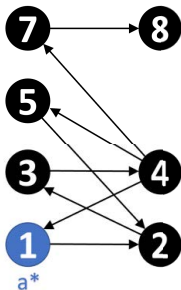
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## Bipart-GG: example

### Rules

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Given  $G = A \dot{\cup} B$ ,  $\forall (a, b) \in E \quad (b, a) \in E$ :

Edge  $(a, b) \longrightarrow$  Domino  $[a|b]$  to player A

Edge  $(b, a) \longrightarrow$  Domino  $[a|b]$  to player B

(Direction encoded by who gets which domino)

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$\hookrightarrow$  Differences to care about:

**BIPARTITE-GG**  $\stackrel{\wedge}{=}$  **2p-COMP-DOM**

Blocking opponent (cannot move token)  $\stackrel{\wedge}{=}$  Blocking opponent or  
getting rid of all dominoes

One-sided chain  $\stackrel{\wedge}{=}$  **Two-sided** chain (queue)

Start at  $a^*$   $\stackrel{\wedge}{=}$  A starts with **any** of his  
dominoes



## Eliminate Win by Getting Rid

Nonsense domino [#|#] to both players:

Player 1

#	#
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Player 2

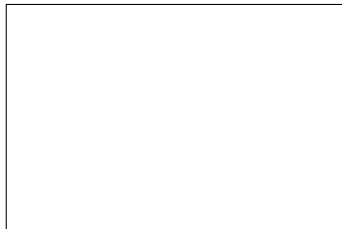
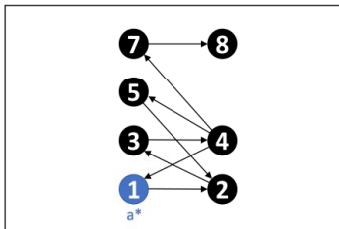
#	#
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- can only be connected to other player's nonsense [#|#]
- nobody would play *nonsense* in first turn:

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⇒ nobody runs out of dominoes ⇒ only win by blocking opponent

## Make Chain One-Sided



Player 2 starts in domino

- Give Player 2 *start-domino* [ $a^* \mid :-)$ ] (" $:-)$ " unique)

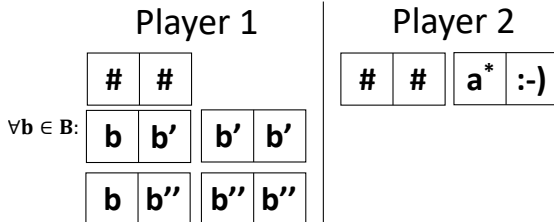
Player 1

#	#
---	---

Player 2

#	#	$a^*$	$:-)$
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# Force Start-Domino



- Give Player 1 *garbage dominoes*  $\forall b \in B : [b, b'], [b', b'], [b, b''], [b'', b'']$

Lemma: this domino distribution enforces P2 to play *start domino* first<sup>2</sup>

---

<sup>2</sup> Assuming P2 makes first move.

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Proof.

P2 cannot start with nonsense domino (see before).

P2 cannot start with an edge Domino:

**Case 1:** P2 starts with  $[a|b]$ ,  $a \neq a^*$ .



**Case 2:** P2 starts with  $[a|b]$ ,  $a = a^*$ .



---

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winning strategy in Bipartite-GG  $\iff$  winning strategy in  
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Polynomial time ✓

$\text{BIPARTITE-GG} \leq_p \text{2P-COMP-DOM}$





## Corollary

*p-player cooperative dominoes is NP-complete for any fixed  $p \geq 2$*

- $\in NP$ : certificate
- NP-hard: p-player can simulate any 2-player game

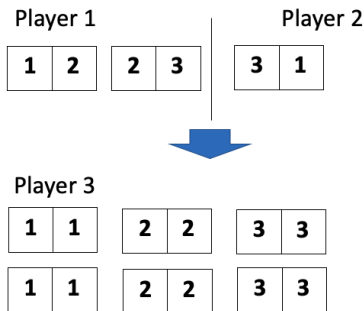
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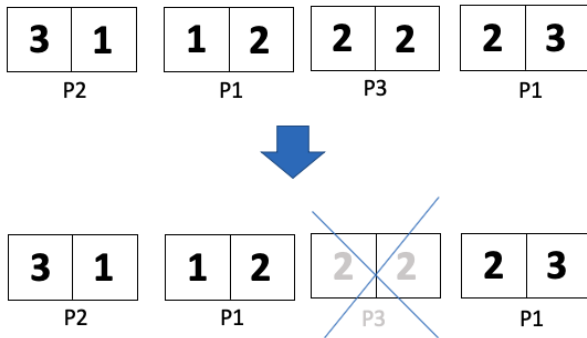
*p-player competitive dominoes is PSPACE-complete for any fixed  $p \geq 2$*

- $\in PSPACE$  as in Lemma 4
- PSPACE-hard: p-player can simulate any 2-player game

- p-player can simulate any 2-player game by introducing p-2 "null" players
- give each null player a domino  $[a \mid a]$  for each face  $a$  that appears in the set of dominos of player 1 and 2

Example ( $p = 3$ )





3-player game corresponds to 2-player game

## Conclusion

- Determined complexity of domino game under different variants
- Single-Player is easy (in P)
- All other variants are intractable
- Caveats:
  - No Passing
  - Uneven number of dominoes
  - Multisets
- Can the model be extended?

# Appendix: GG is PSPACE hard (and complete)

*GO is Polynomial-Space Hard*

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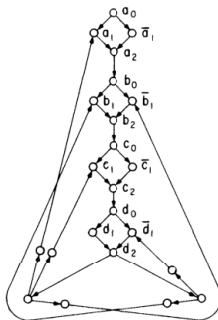


FIGURE 1

representing universally quantified variables), and the other player chooses which path to take through  $\exists$ -diamonds. After all diamonds have been traversed, the  $\forall$ -player chooses a clause, and the  $\exists$ -player then chooses a variable from that clause.  $\exists$  then wins immediately if the chosen variable satisfies the clause; otherwise,  $\forall$  wins on the next move. It follows easily that  $\exists$  wins iff  $B$  is true, and we leave the details to the reader.  $\square$

Figure: From [LS80]

## Bibliography



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