

# Two Influence Maximization Games on Graphs Made Temporal<sup>1</sup>

Niclas Böhmer   Vincent Froese   Julia Henkel  
Yvonne Lasars   Rolf Niedermeier   Malte Renken

Technische Universität Berlin, Algorithmics and Computational Complexity

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# Influence Maximization Games

A game-theoretic model for studying

- ▶ spread of information/influence,
- ▶ opinion diffusion (viral marketing, “word-of-mouth”),
- ▶ dissemination processes (disease spreading),
- ▶ ...

Model:

- ▶ Undirected (static) graph  $G = (V, E)$  and  $k \geq 2$  players.
- ▶ Players choose a subset of  $V$  in order to “influence” (color) as many other vertices as possible.
- ▶ Payoff of a player is the number of vertices she colored.

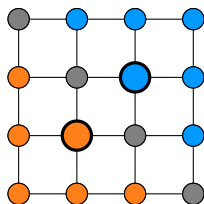
# Two Games on Static Graphs

Here:  $k = 2$  players selecting one vertex (simultaneously).

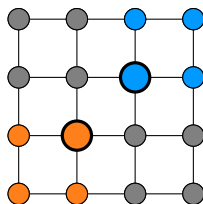
**Diffusion Game:** Vertices are colored by a propagation process:

- ▶ An uncolored vertex having only one player's color in its neighborhood is colored with this color.
- ▶ A vertex with both colors in its neighborhood is colored "gray" (standoff).

**Voronoi Game:** A player colors all vertices that are closest to her.



Diffusion



Voronoi

# Related Work

## Diffusion Games:

Introduced by Alon, Feldman, Procaccia, and Tennenholtz (IPL '10).

Existence of Nash equilibria on various graph classes for different numbers of players well studied.

[IPL '12, IPL '13, AAIM '14, WADS '15, DAM '16, IM '16, SOFSEM '20]

## Voronoi Games:

Introduced by Dürr and Thang (ESA '07).

Focus also on existence of Nash equilibria on graph classes.

[MFCS '08, WINE '09, TCS '15, TCS '20]

# Contributions

**Fact:** Real-world (e.g. social) networks change over time.

↪ Study influence maximization games on temporal graphs.

Temporal graph games not much studied in the literature so far.

(Erlebach and Spooner (SOFSEM '20): Cops-and-Robber game on edge-periodic graphs)

## Our Contributions:

- ▶ Initiate game-theoretic studies on temporal graphs.
- ▶ Generalize Diffusion and Voronoi games to temporal setting.
- ▶ Analyze existence of Nash equilibria in temporal paths/cycles.
- ▶ Observe complex and quite different behaviour of the two temporal games (in contrast to the static case).

# Temporal Graph Games

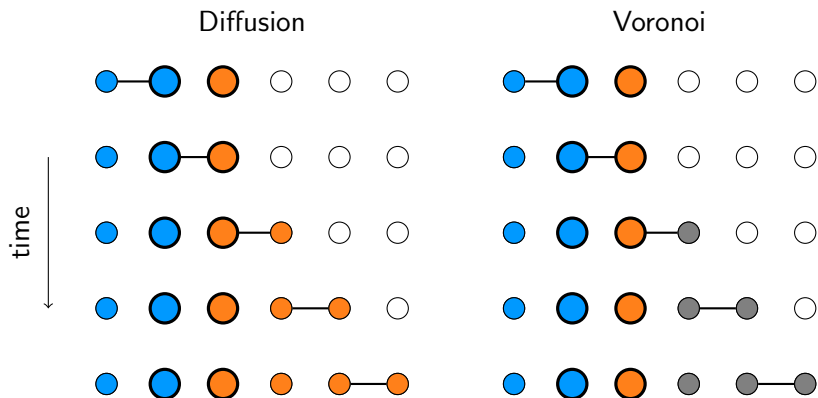
- ▶  $\mathcal{G} = (V, E_1, \dots, E_\tau)$ : temporal graph
- ▶  $E_t$ : set of edges present in step  $t$

**Temporal Diffusion Game:** Analogous to static case using edges in  $E_t$  in step  $t$  of the propagation process. Propagation continues on  $G_\tau = (V, E_\tau)$  until finished.

**Temporal Voronoi Game:** A player colors all vertices which she reaches earlier (arrival time of a strict temporal walk). Last layer  $G_\tau$  may be repeated arbitrarily often (allowing arrival times  $> \tau$ ).

**Note:** If  $E_1 = E_2 = \dots = E_\tau$ , then temporal diffusion and Voronoi games are equivalent to the static variants.

## Example



**Note:** Static diffusion and Voronoi games are identical on paths (and cycles) and always have a Nash equilibrium.

# Overview

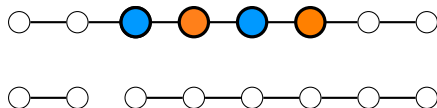
Our results on guaranteed existence (✓) of a Nash equilibrium:

	Growing ( $E_t \subseteq E_{t+1}$ )	Superset ( $E_t \subseteq E_\tau$ )	Shrinking ( $E_t \supseteq E_{t+1}$ )
<b>Diffusion</b>			
Temporal Paths	✓ $O(n)$	✓ $O(n)$	✗
Temporal Cycles	✓ $O(n\tau)$	✗	✗
<b>Voronoi</b>			
Temporal Paths	✓ $O(n^2)$	✗	✗
Temporal Cycles	?	✗	✗

Temporal path/cycle = underlying graph is a path/cycle



# A Shrinking Temporal Path



No Nash equilibrium in diffusion or Voronoi game.

## Lemma

*Temporal diffusion and Voronoi games are equivalent on shrinking temporal paths and cycles.*

## Theorem

*Temporal diffusion and Voronoi games are not guaranteed to have a Nash equilibrium on shrinking temporal paths or cycles.*

# Overview

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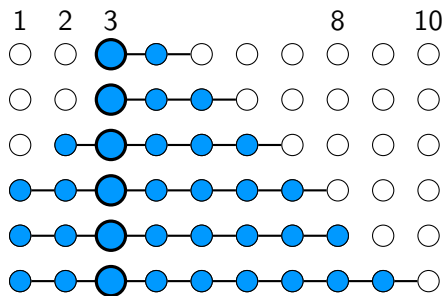
# Voronoi Game on Growing Temporal Paths

## Theorem

Let  $\mathcal{P} = ([n], E_1, \dots, E_r)$  be a growing temporal path. Then, there exists a Nash equilibrium in the temporal Voronoi game on  $\mathcal{P}$ .

Proof based on analyzing best responses using “boundaries”:

A vertex  $u \leq v$  is a **left boundary** of  $v$  if  $v$  reaches  $u$  before the edge  $\{u-1, u\}$  appears (right boundaries analogous).

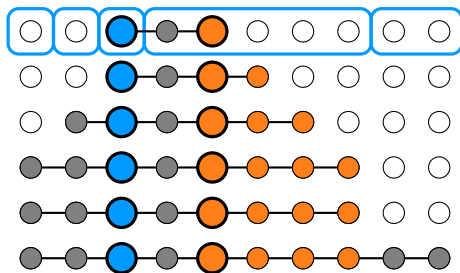


Boundaries of 3: 1, 2, 3, 8, 10

# Best Response

## Observations:

- ▶ Boundaries partition vertices into intervals.
- ▶ A player can only color vertices within a boundary interval of the other player.
- ▶ Best response: Choose a largest boundary interval  $I$  of the other player and choose the vertex in  $I$  that is closest to the other player.



**Lemma** *Every best response sequence contains a Nash equilibrium after at most  $n$  steps.*

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# Conclusion

Temporal diffusion and Voronoi games are rich of complex behaviour even on temporal paths and cycles.

Forbidding edges to disappear helps to guarantee Nash equilibria.

## Future Work:

- ▶ Other temporal graph classes
- ▶ Model variations (more players, limited time horizon, different payoff)
- ▶ Other temporal distances for Voronoi games (non-strict, fastest, shortest)
- ▶ Playing other games on temporal graphs

Thank you!