

# Optimal parallel repetition for projection games on low threshold rank graphs

Madhur Tulsiani, John Wright, Yuan Zhou

TTIC

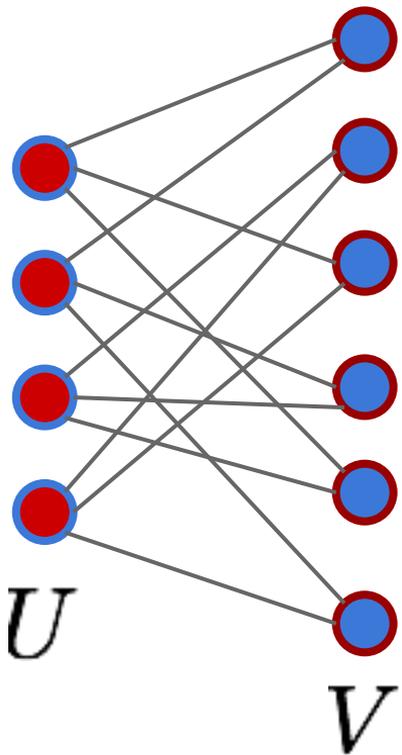
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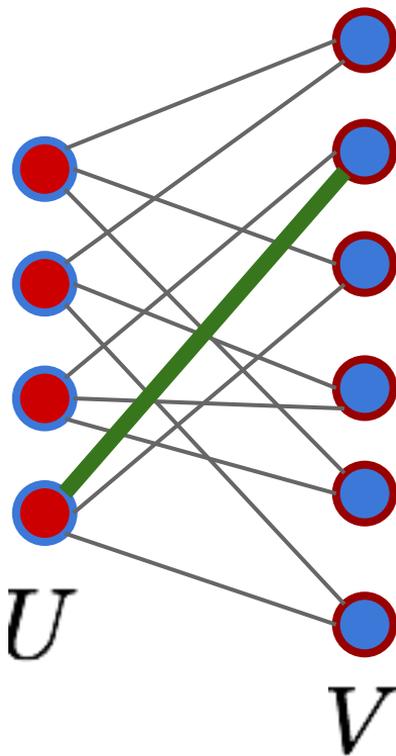
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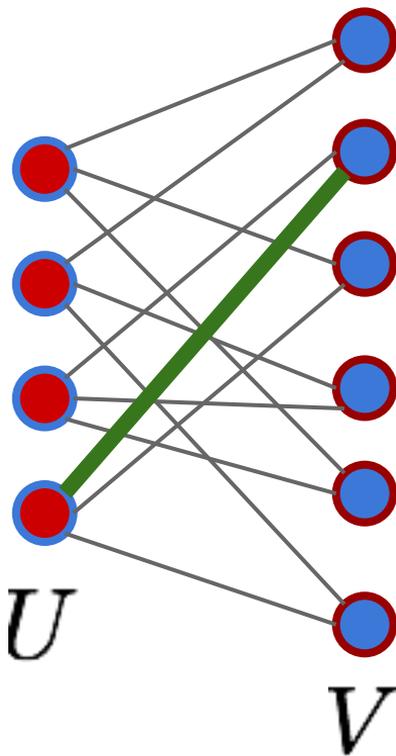
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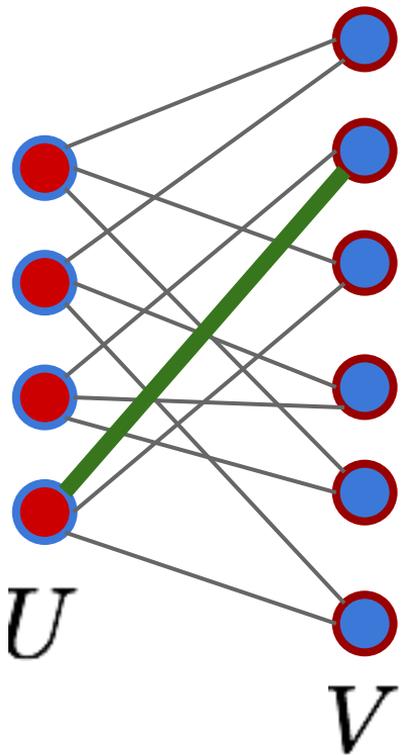
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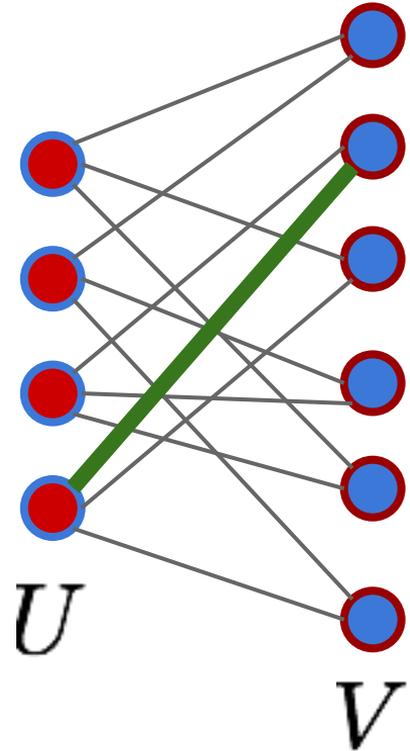
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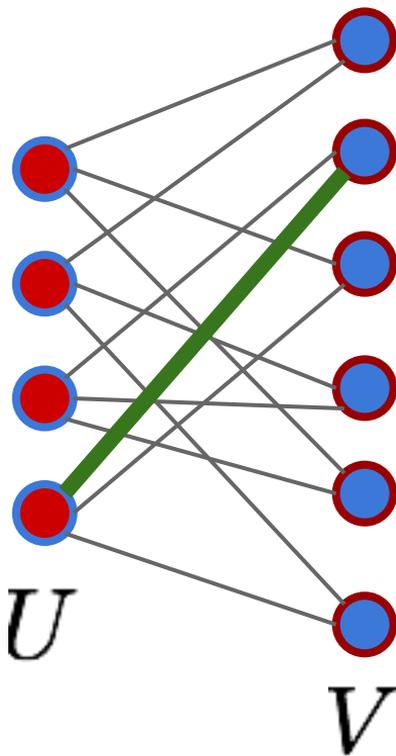


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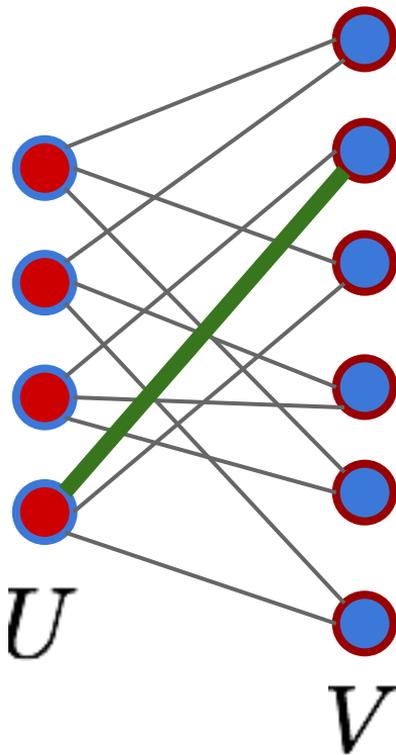
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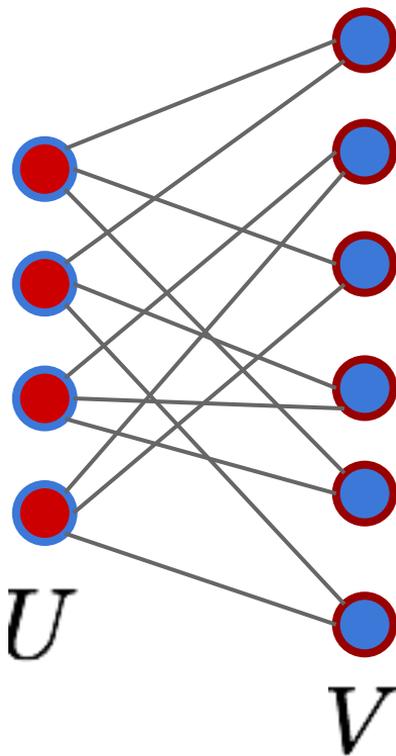
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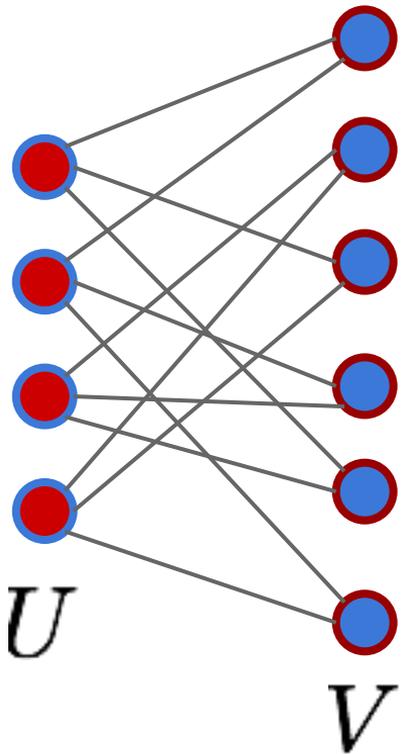
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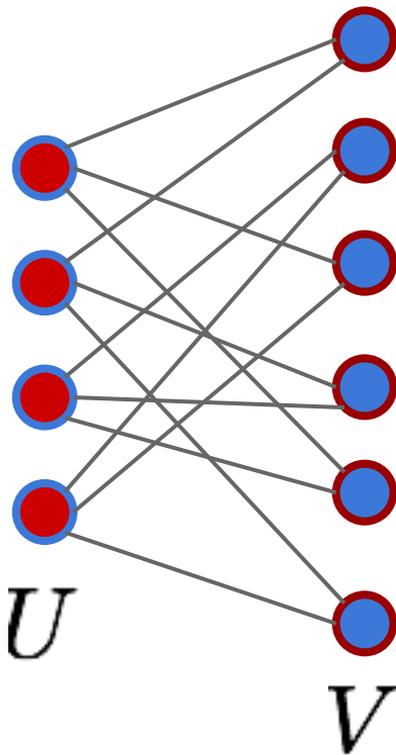
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Bipartite graph  $G = (U \cup V, E)$

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$G$  is a **projection game** if for every  $b$ , only exists one  $a$  to satisfy  $\pi_{uv}$



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**no strong parallel repetition in general**

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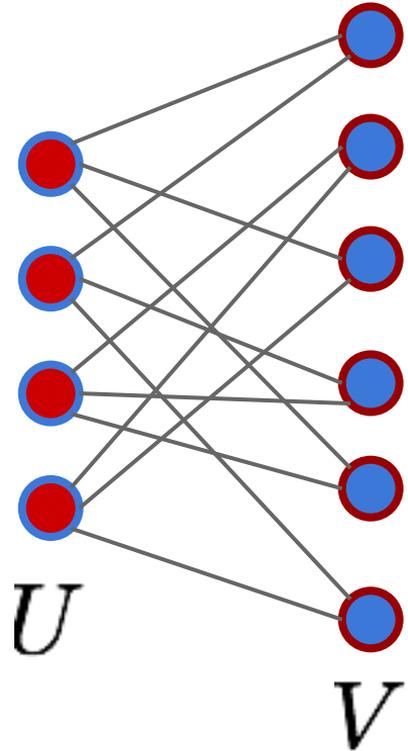
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# Expanding games

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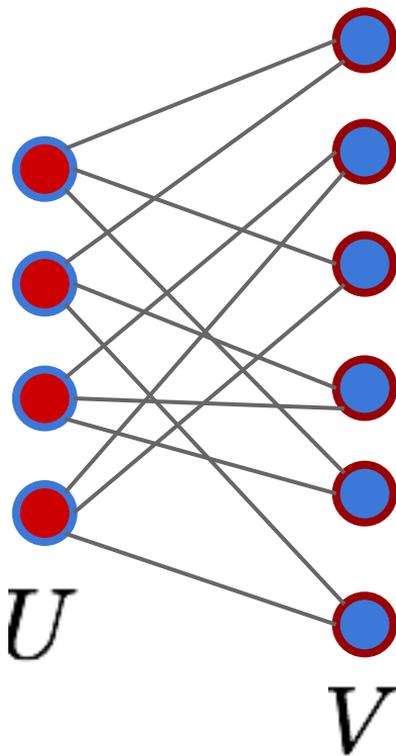


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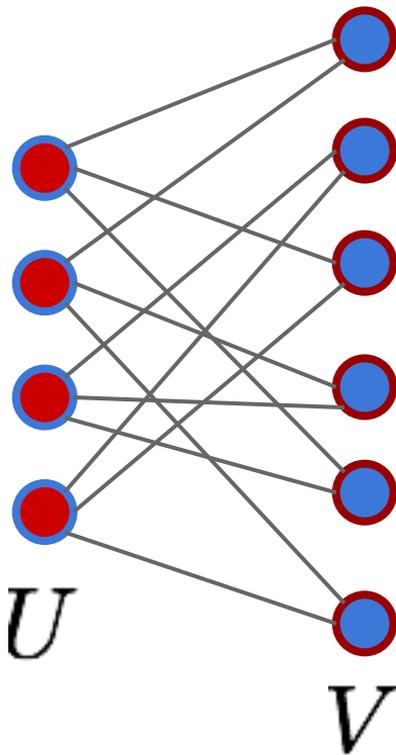
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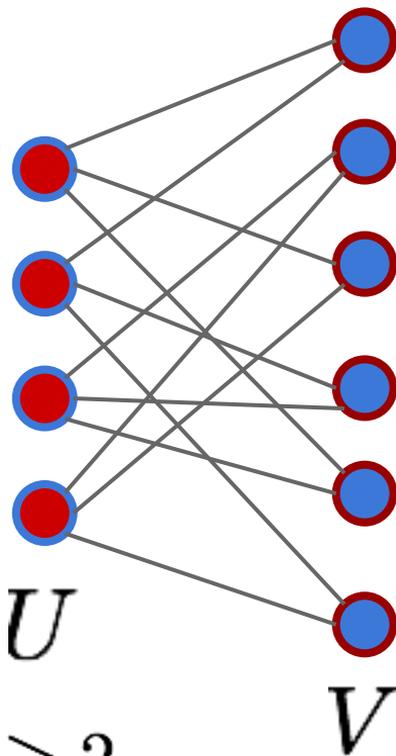
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$G$  is an **expanding game**

if  $\sigma_2$  is small.

$G$  has **low threshold rank**

if  $\sigma_k$  is small for some small  $k \geq 2$ .



# Strong PR for Expanding Games

Let  $G$  be a projection game with 2<sup>nd</sup> largest singular value  $\sigma_2$ . If  $\text{val}(G) = 1 - \eta$ , then

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Q2: What about games with **low threshold rank**?

# Main result

Let  $G$  be a projection game with  $k$ -th largest singular value  $\sigma_k$ . If  $\text{val}(G) = 1 - \eta$ , then

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**Improves** on Raz and Rosen when  $k = 2$ .

**Optimal** for all fixed  $k$ .

# Proof strategy

Parallel repetition framework of **[Dinur Steurer]**

+

Strong Cheeger's inequality due to **[KLLGT13]**

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[Dinur Steurer 2014]

New framework for proving parallel repetition theorems using **linear algebra**.

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New proof that  $\text{val}(G^{\otimes k}) = (1 - \eta^2)^{\Omega(k)}$  if  $G$  is a **projection game** [originally from Rao]

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Connects PR to **Cheeger's inequality**.

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(**conductance** of  $G$ )

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Proof that  $\text{val}(G^{\otimes k}) = (1 - \eta^2)^{\Omega(k)}$  if  $G$  is a **projection game** uses Cheeger's inequality.

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Better Cheeger's inequality  $\Rightarrow$  Better PR

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**Strong** Cheeger's inequality  $\Rightarrow$  **Strong** PR

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A **strong** Cheeger's inequality for graphs with **low threshold rank**

( $\approx \lambda_2$  when  $\lambda_k$  is constant. No square lost!)

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every  $k \geq 2$ ,  $\phi(G) \leq O(k) \frac{\lambda_2}{\sqrt{\lambda_k}}$ .

# Main result

Let  $G$  be a projection game with  $k$ -th largest singular value  $\sigma_k$ . If  $\text{val}(G) = 1 - \eta$ , then

$$\text{val}(G^{\otimes n}) \leq \left( 1 - \frac{\sqrt{1 - \sigma_k^2}}{k} \cdot \eta \right)^{\Omega(n)} .$$

## Second result

Let  $G$  be a projection game with  $2^{\text{nd}}$  largest singular value  $\sigma_2$ . If  $\text{val}(G) = 1 - \eta$ , then

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Simple proof: **no Cheeger's needed**

**Thanks!**