Noncommutative polynomial optimization and quantum graph parameters

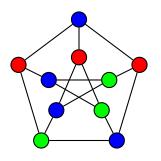
Sander Gribling, CWI

Joint work with David de Laat (TU Delft)

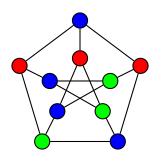
& Monique Laurent (CWI & Tilburg University)



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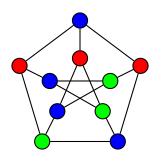


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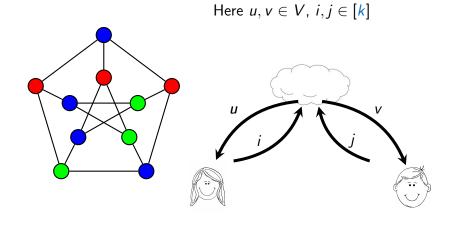


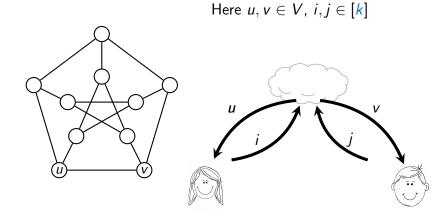
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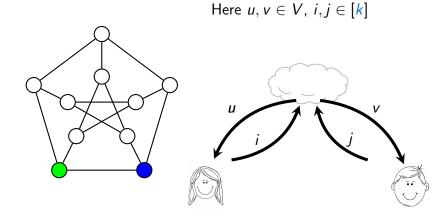
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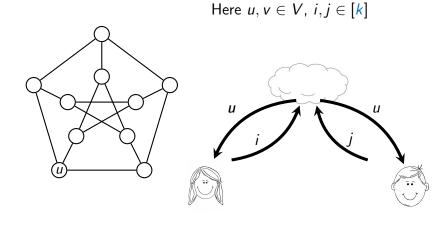


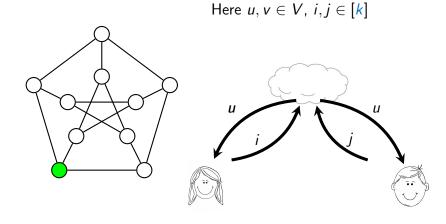
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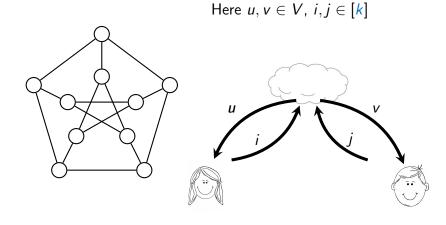


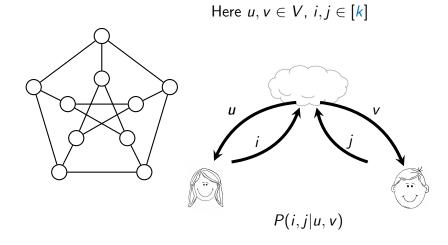


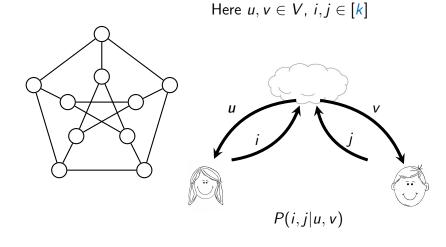




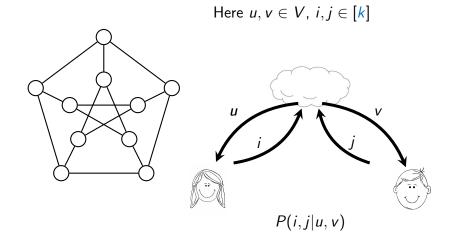




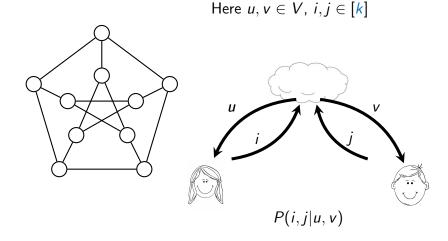




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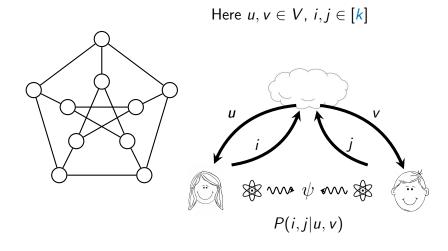


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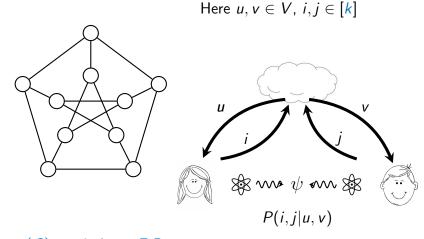
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 $\gamma_t(G) = \chi_q(G)$ if there exists a 'flat' optimal solution

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We show $\xi_{\infty}(G) = \text{tracial rank of } G$ [Paulsen et al. '14] and $\xi_{*}(G) = \text{projective rank of } G$ [Mančinska-Roberson'12] $= \inf \frac{d}{dt} \text{ s.t. } \exists \text{ rk-} r \text{ } d \times d \text{ projectors } X_{u} \text{ s.t. } X_{u} X_{v} = 0 \text{ } (uv \in E)$

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[Dykema-Paulsen'16]

- $\xi_*(G)$ or $\xi_\infty(G)$ irrational \Rightarrow Tsirelson's conjecture is false. We now know that Tsirelson's conjecture is false. Can we find a graph for which $\xi_*(G)$ or $\xi_\infty(G)$ is irrational? (Use the SoS-dual to give lower bounds?)
- ▶ The tracial rank and $\overline{\vartheta}$ are multiplicative wrt the OR product and lexicographical product; what about ξ_t ?