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# *Universal Framework for Wireless Scheduling or Hypergraph Sketches*

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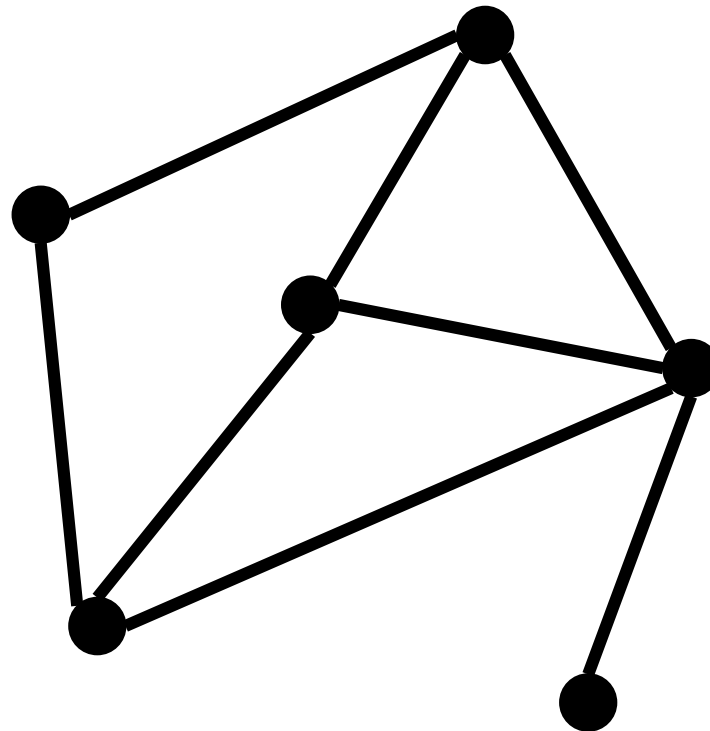
Reykjavik University  
Iceland





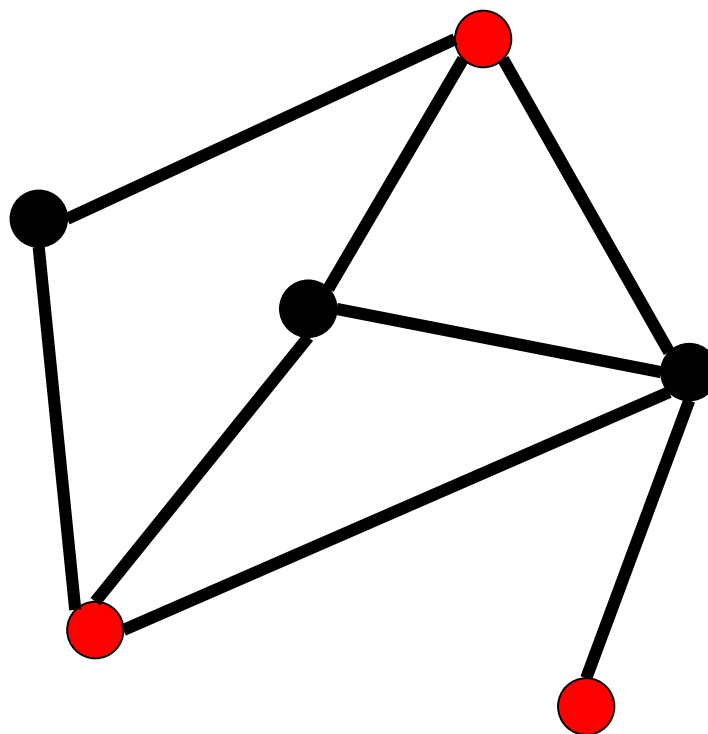
# Graph Coloring : Dealing with Conflicts

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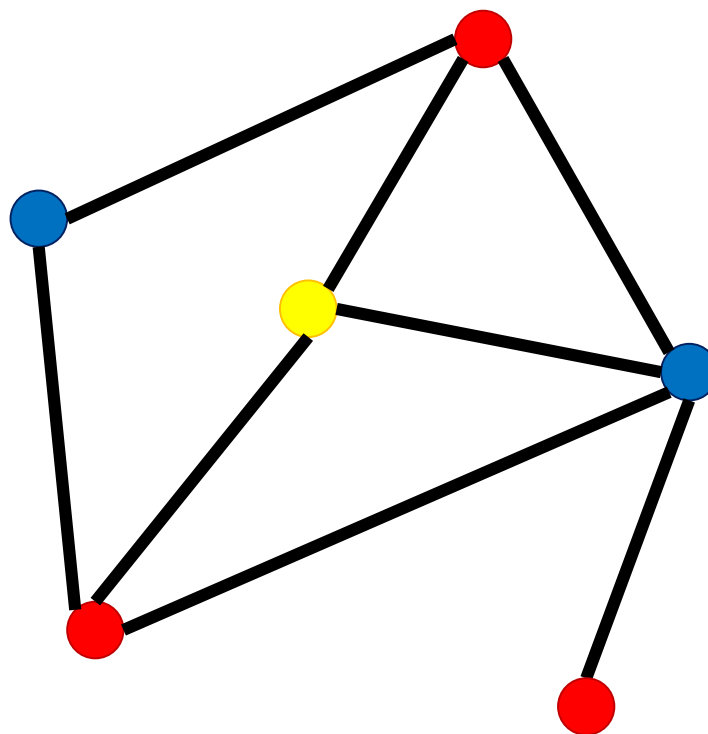
# Graph Coloring : Dealing with Conflicts

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# Graph Coloring : Dealing with Conflicts

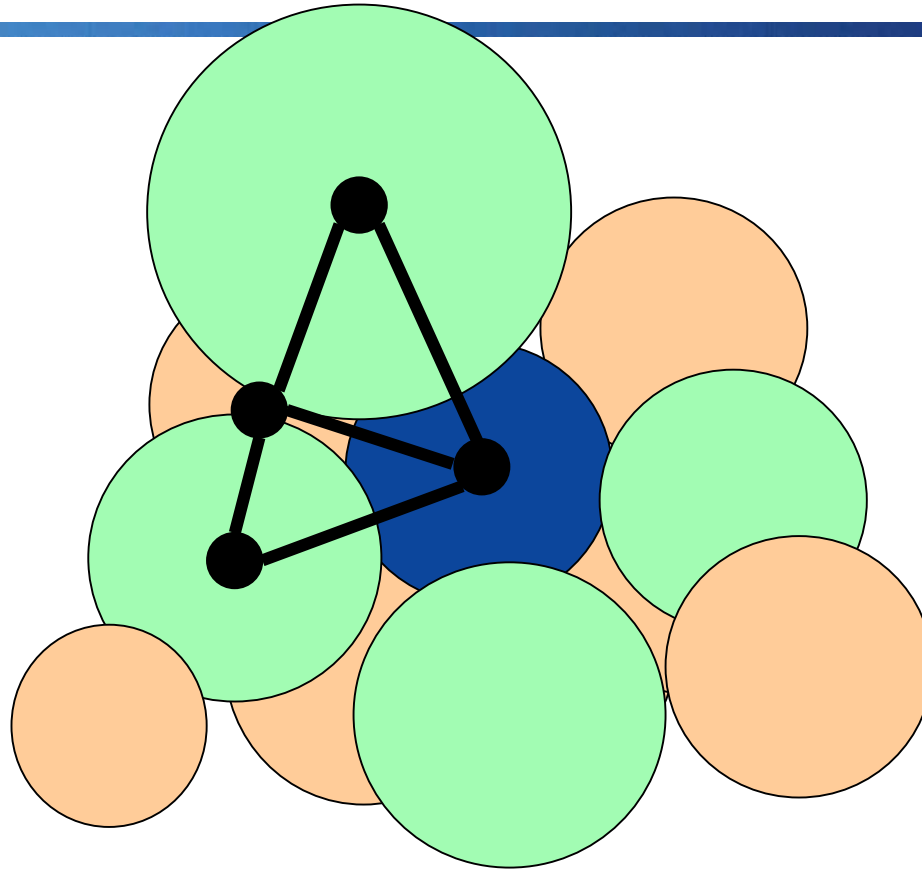
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- But Graph Coloring is computationally hard

# Disc Graphs & k-simplicial graphs

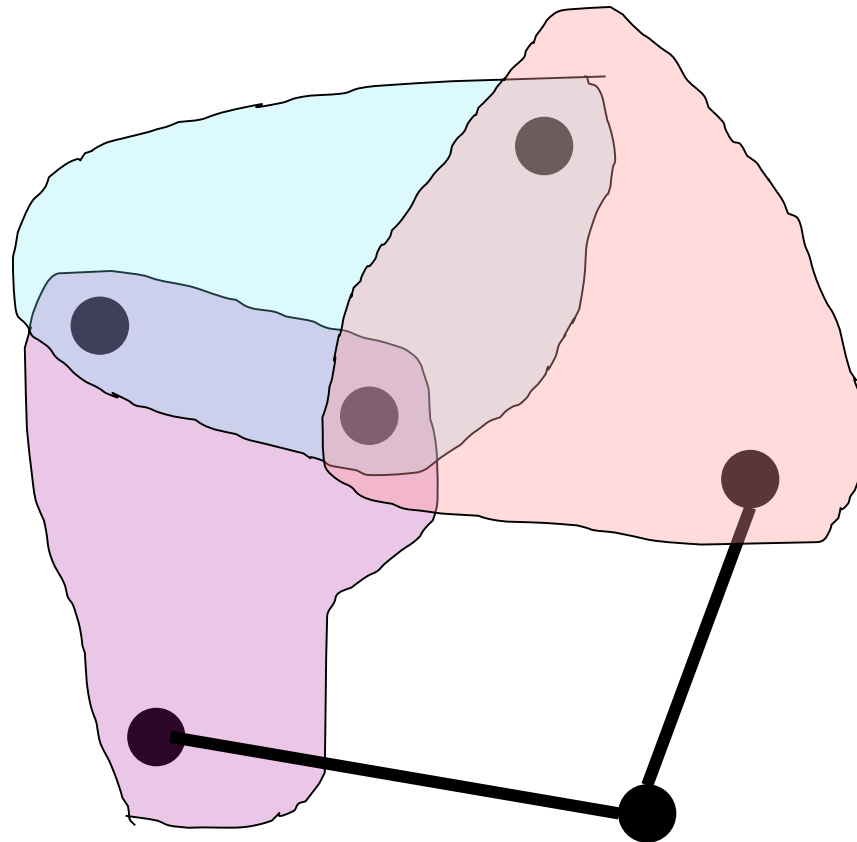
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- Disk graphs are 6-simplicial: The neighborhood of the *smallest* disk can be covered with 6 cliques

# Hypergraphs

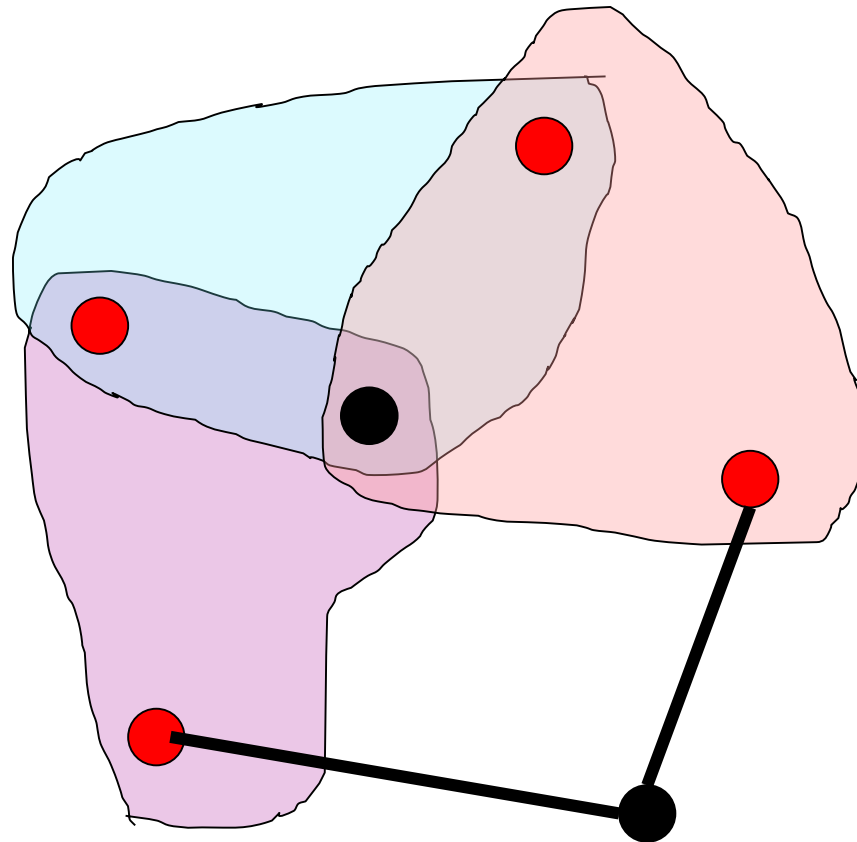
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- Hypergraphs capture more general constraints
  - „At most two out of these three can be active simultaneously“

# Hypergraphs

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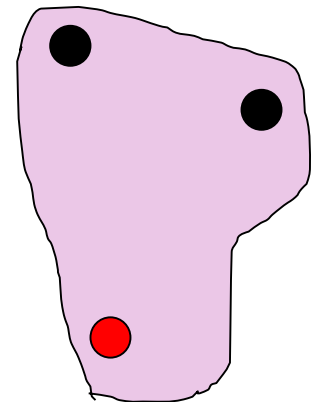
- Hypergraphs capture more general constraints
  - „At most two out of these three can be active simultaneously“

# Hypergraphs: More general conflicts/constraints

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So, why don't we use hypergraphs all the time?

- Because they are not very amenable
  - Less structure – less that can be done
  - Problems often become much harder
  - Limited theory that can be leveraged
  - More complex to analyze and conceptualize
- An edge forces OPT to use different colors. Not so for a hyperedge.





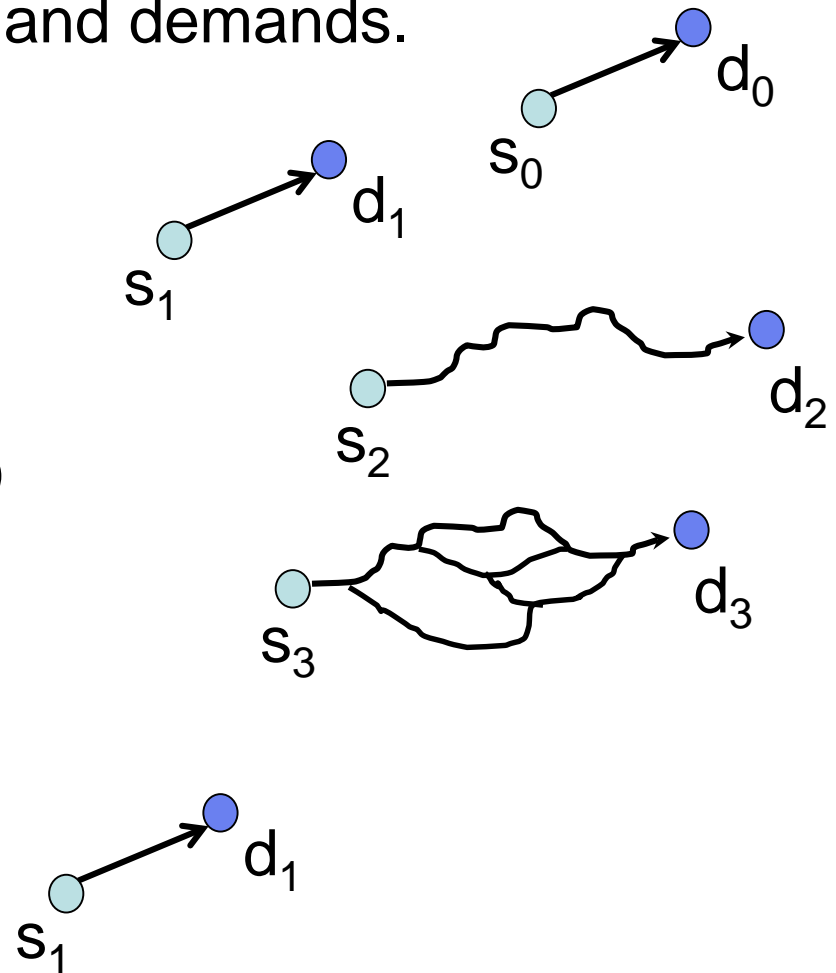
# Utilizing wireless networks

- *Given:* Sources, destinations, and demands.

- *Optimize:* „Throughput“

- *Using:*

- Time multiplexing (= scheduling)
- Channels (frequencies, codes)
- Power control
- Space diversity
- Routing
- Bit-rate control

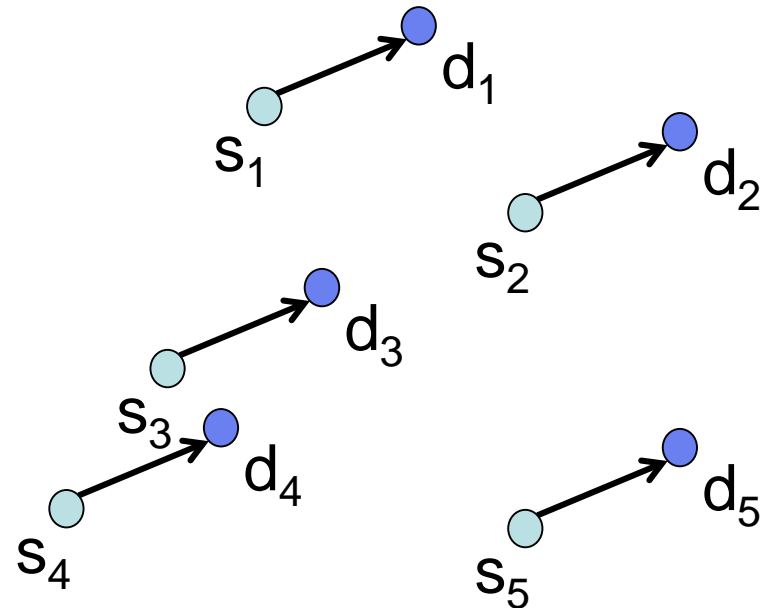


# Core subproblem: Link Scheduling

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- *(Shortest) Link Scheduling problem*
- *Given:* Links (sources, destinations)

- *Using:*
  - ~~— Channels (frequencies, codes)~~
  - Power control
  - (TDMA) scheduling
  - Space diversity
  - ~~— Routing~~
  - ~~— Rate adjustment~~



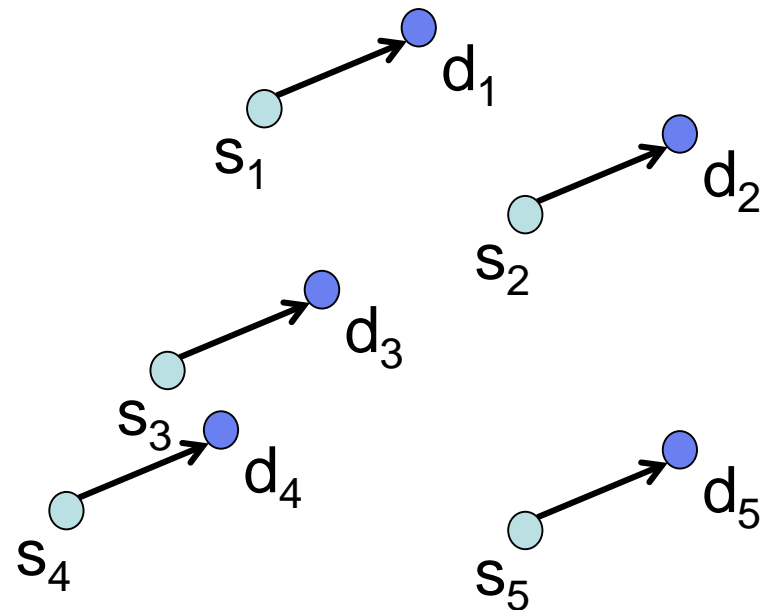
- *Minimize the number of slots used*

# Related problem: MIS

- *MIS = „Max Independent Set of Links“*,
- *Given:* Links (sources, destinations)

- *Using:*

- ~~— Channels (frequencies, codes)~~
- Power control
- ~~— (TDMA) scheduling~~
- Space diversity
- ~~— Routing~~
- ~~— Rate adjustment~~

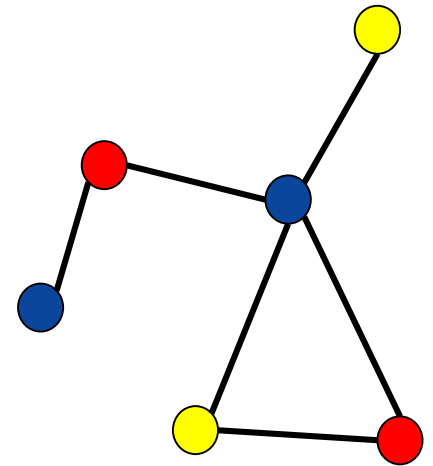
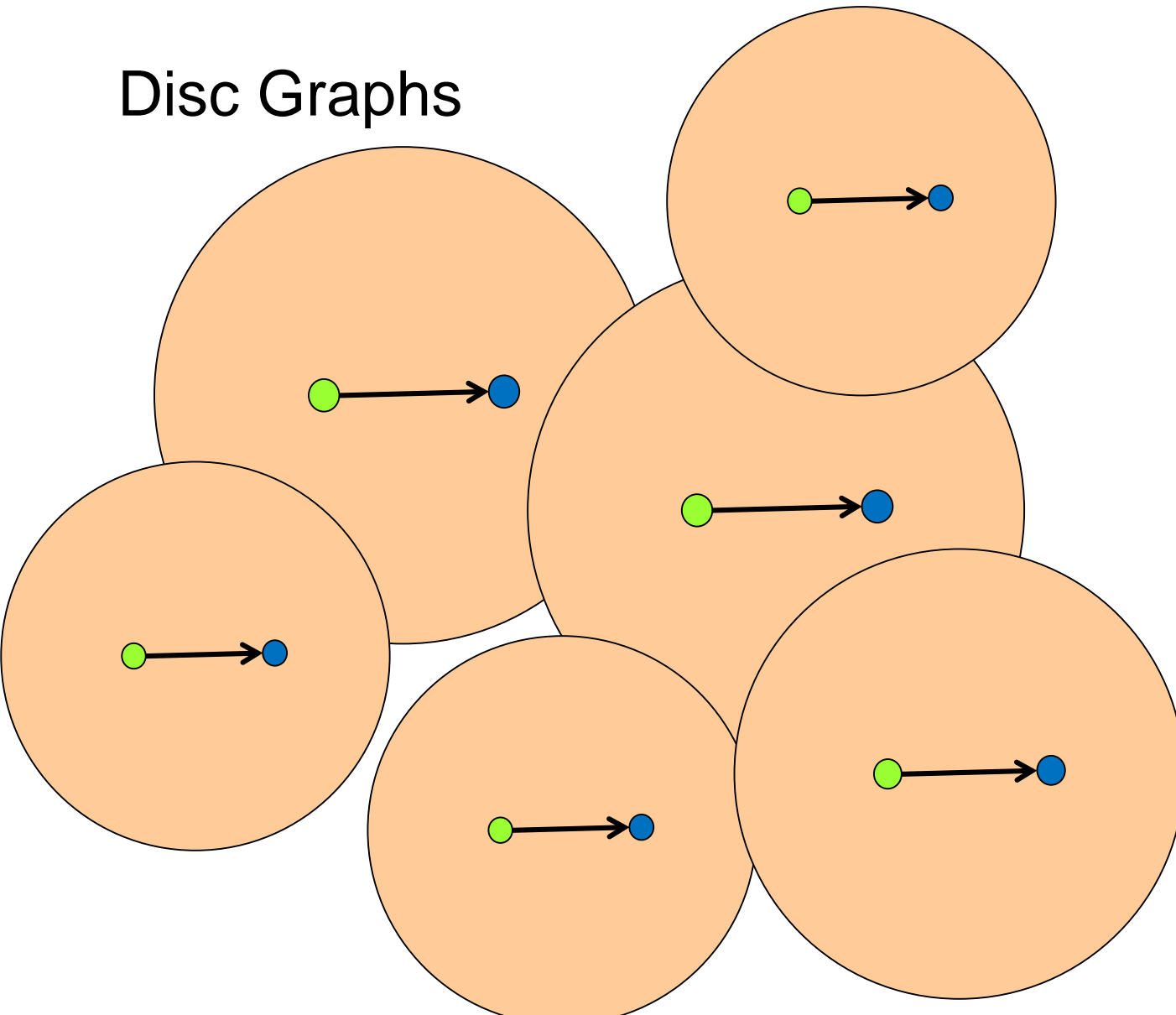


- *Maximize the number of links in a single slot*

# Interference model : Disk Graphs

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## Disc Graphs



# Interference: The challenging part of wireless

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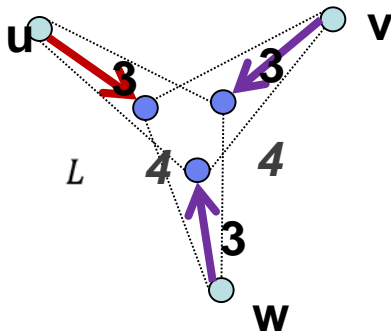


What matters:

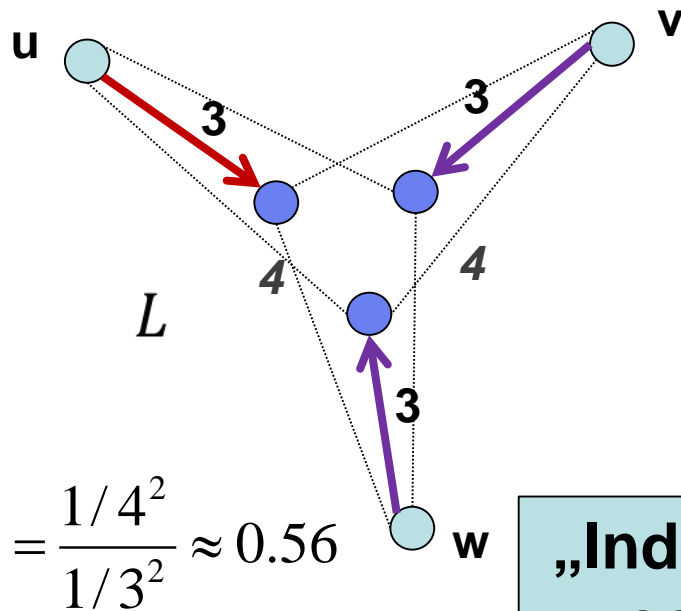
*Is the received signal strength sufficiently large compared with the interference?*

# „Physical“ or SINR model

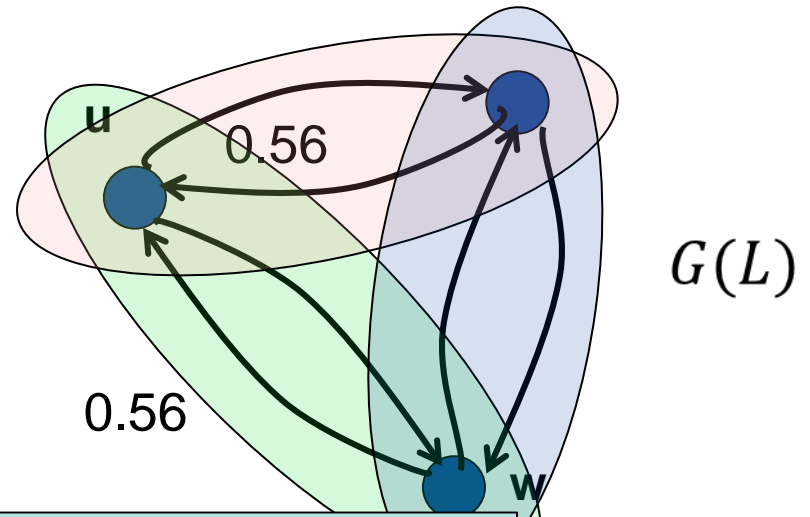
1. Additivity: Interference is *additive*
2. Threshold: Transmission succeeds if interference is below the „interference budget“
3. Distance based: Signal strength decreases polynomially with distance



# Fractional conflict graphs



$$a_u(w) = \frac{1/4^2}{1/3^2} \approx 0.56$$

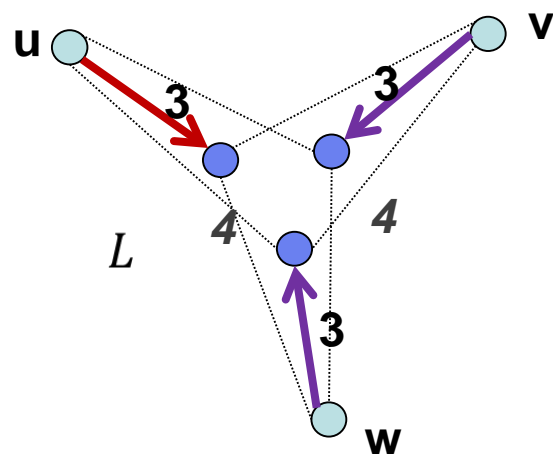


„Independent set“ in the conflict hypergraph

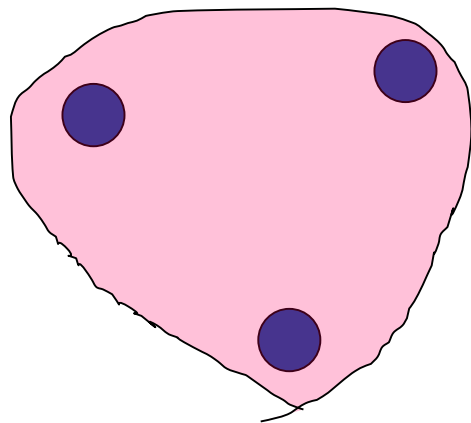
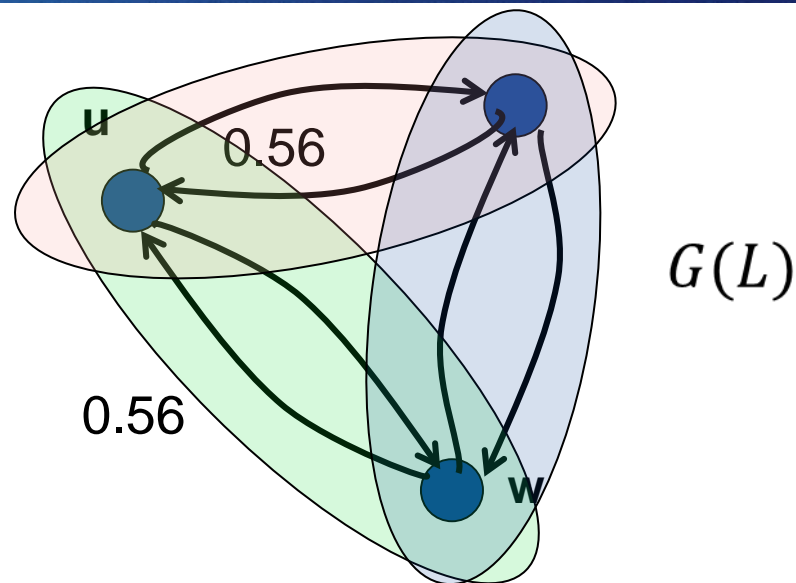
Given set  $L$  of links,  $G(L)$  is the conflict graph. Weight of edge  $ij = \text{Relative interference of link } i \text{ on link } j$

A set  $S$  is **feasible** iff the weighted in-degree of every link within  $G(S)$  is  $< 1/\beta$

# Fractional conflict graphs and conflict hypergraph



Input links



Conflict hypergraph

Fractional conflict graph & independent sets



# Approximation Results on MIS in SINR model

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MIS has constant-factor approximations for:

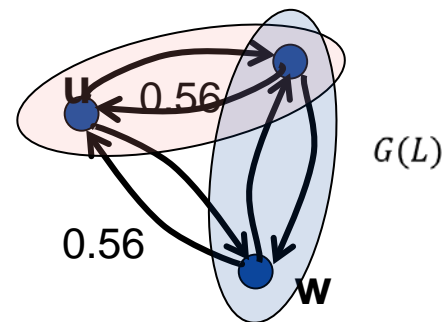
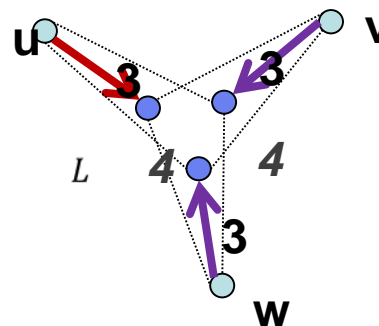
- Uniform power in  $\mathbb{R}^2$ .  
[Goussevskaia, H, Wattenhofer, Welzl'09]
- Other fixed power in general metrics [H, Mitra, SODA'11]
- Arbitrary power control [Kesselheim, SODA'11]
  - Also, with power limitations [Wan'12, Kesselheim'12]
- Different fixed bit-rates [Kesselheim'12]
- Uniform power with spectrum sharing [H, Mitra'12]
  - with distributed learning [Asgeirsson, Mitra, '11]
  - under jamming [Dams et al...]
- Holds also for an extension to Rayleigh fading  
[Dams, Hoefer, Kesselheim '13], [H, Tonoyan '17]

*Intuition:* Can ignore links with too much interference.

# Scheduling in SINR model [in 2015]

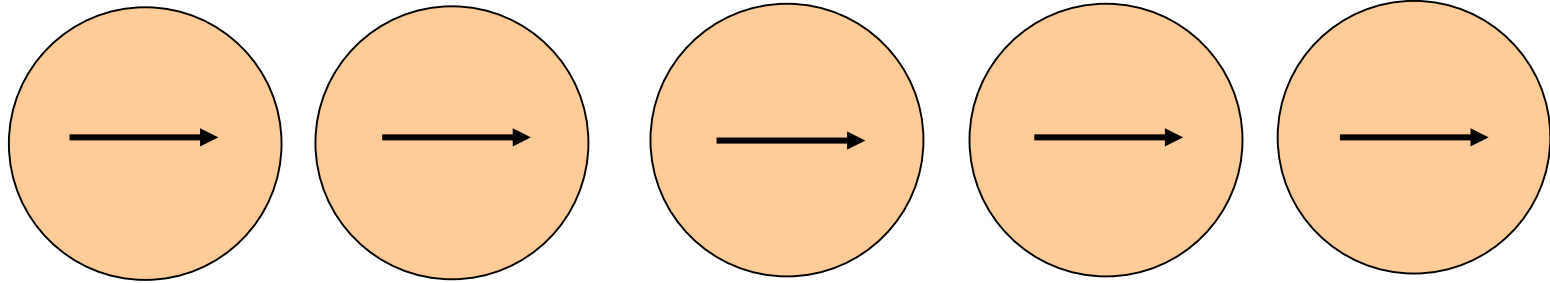
Scheduling (Coloring the conflict hypergraph):

- $O(\log n)$ -approximation [Direct from MIS results]
- $O(\log \Delta)$ -approximation ( $\Delta =$  link length diversity)
- Known algorithms give  $\Omega(\log n)$ -approximation [HKT '15]
  - None of the previously known techniques suffice to improve the performance guarantees
- $\Rightarrow$  Fractional graphs are harder than graphs
- $\Rightarrow$  Hypergraphs are harder than graphs



# Equal-sized links

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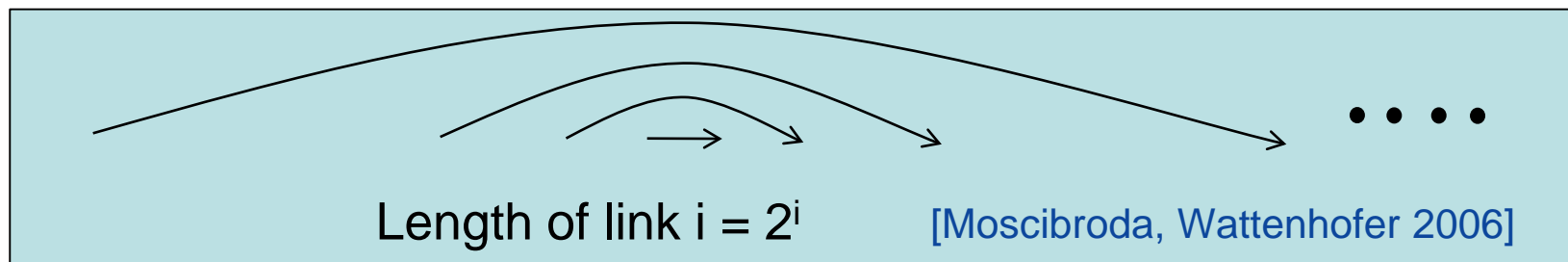


- If the links are evenly spaced, then the (relative) interference is a *converging geometric sum*  
*[Goussevskaja, Oswald, Wattenhofer '06]*
- Can model the links with *unit disks* (in an approximate sense) → *Unit disk graphs!*  
*[H '09]*

# Disc Graphs natural for different-sized links

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But they fail miserably!



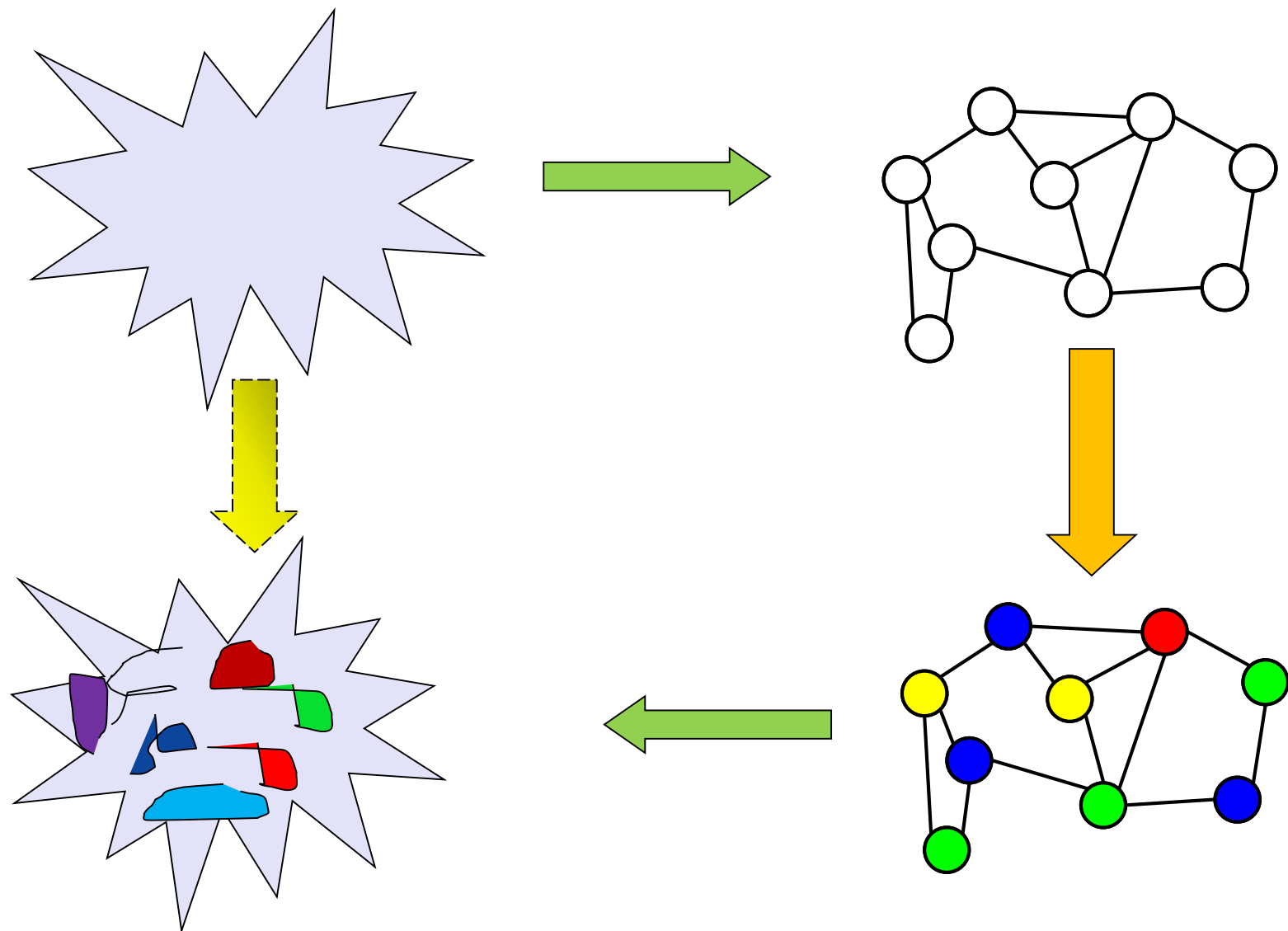
Feasible set but forms a clique in any disc graph

# Core concept of this talk: Hypergraph sketches

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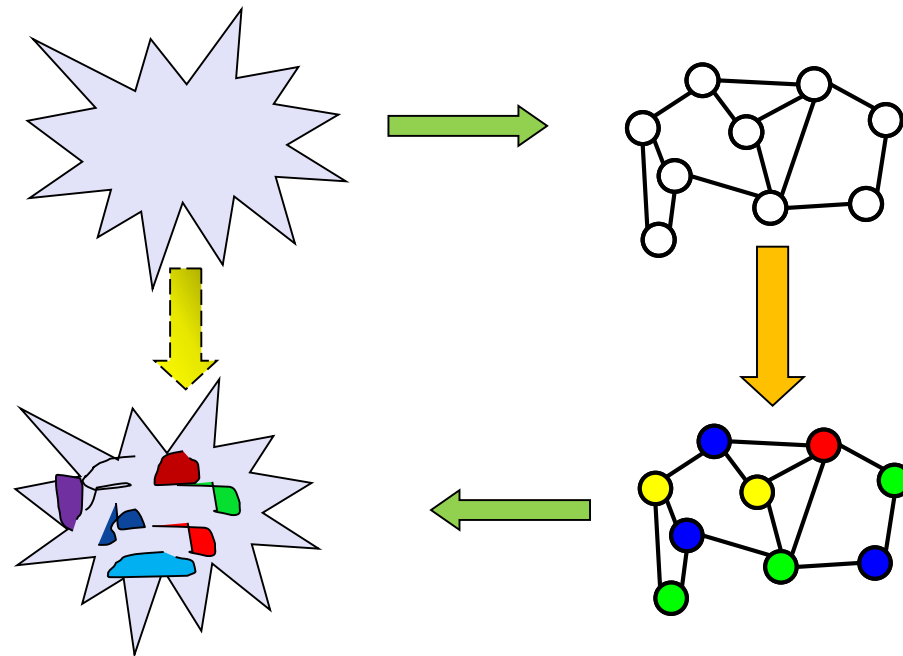
- Key question: If hypergraphs are so messy and hard to deal with, can we replace them with something easier?
- Can we replace them with ordinary graphs?

# Approach: Abstract, solve, map back



# Price of abstraction

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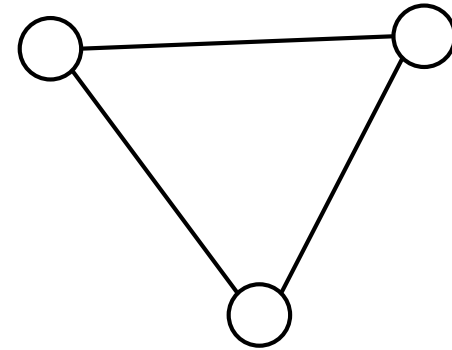
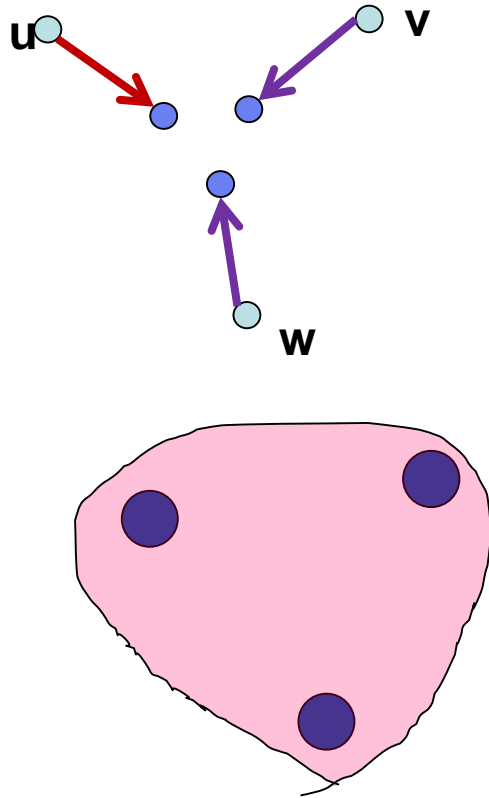


- Price of abstraction :

How much you lose by solving the abstracted problem  
(rather than solving directly)

# Representing link scheduling with a graph

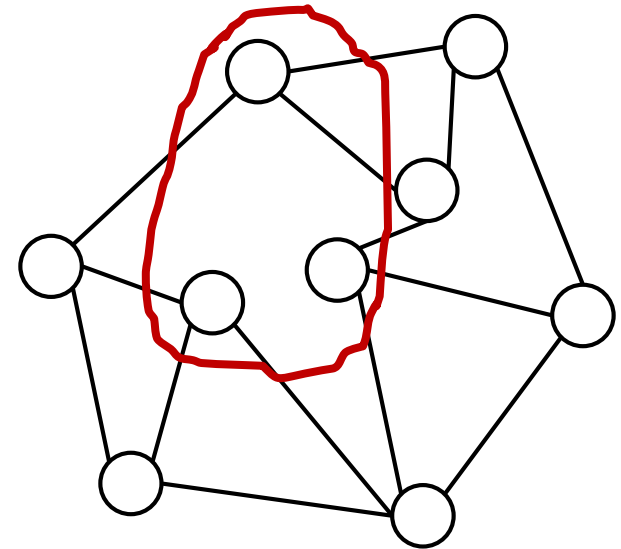
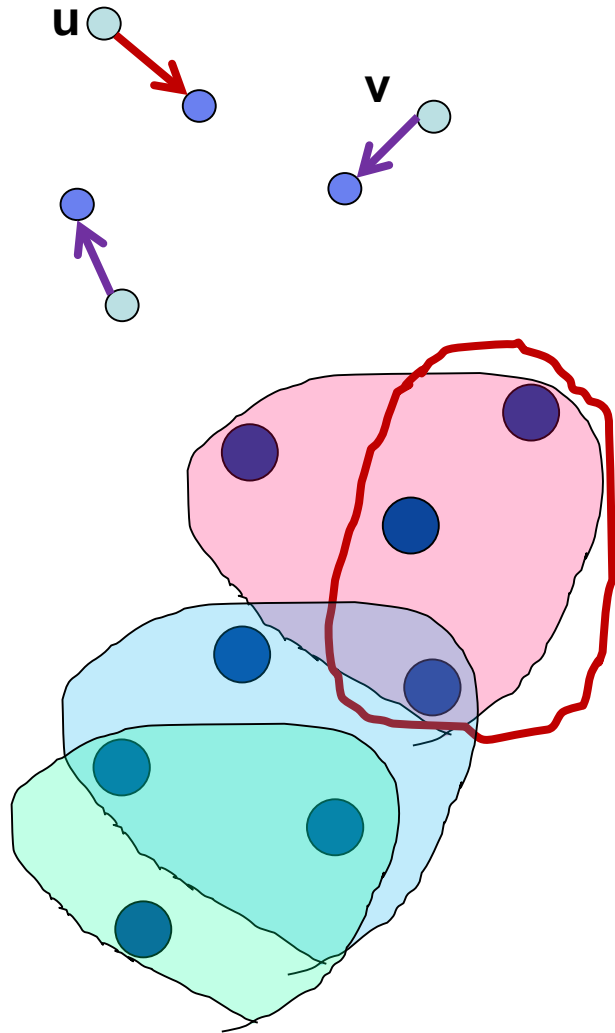
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When should there be an edge?



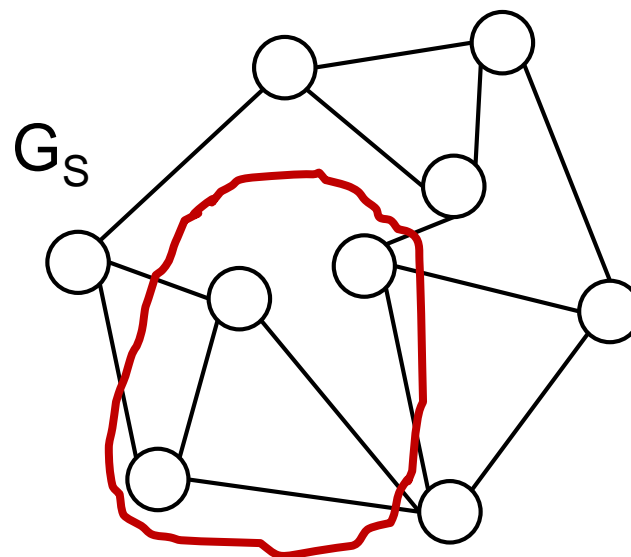
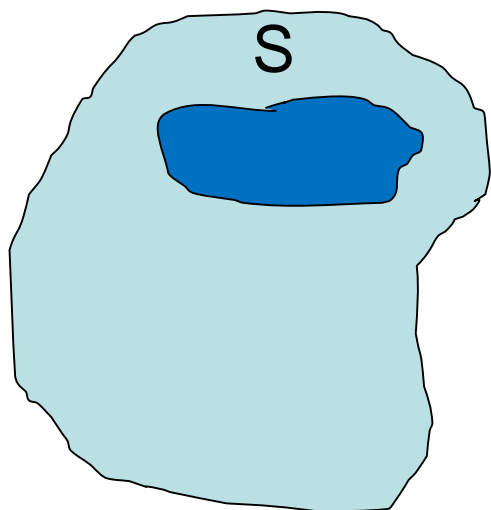
# Requirement I: Feasibility



Independent sets  
should be feasible

valid coloring of  $G \Rightarrow$   
valid scheduling  
= valid coloring of  $H$

# Requirement II: Effectiveness



Small cost of abstraction!

Feasible linksets should be „nearly independent“ in  $G$

$S$  feasible  $\Rightarrow \chi(G_S)$  small

# Graphs sketching hypergraphs

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- Given: Conflict hypergraph  $H$
- Find: Schema to form a graph  $G$  s.t.
  1.  $S$  is an independent set in  $G$ 
    - $S$  is independent in  $H$
  2.  $S$  is independent in  $H$ 
    - $G(S)$  has low chromatic number,  **$k$**

Cost of schema = *largest value*  **$k$**

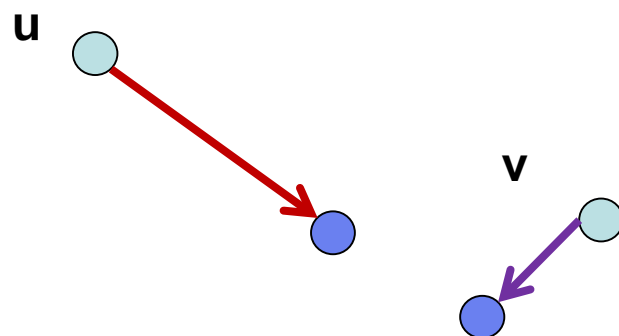
Price of graph abstraction = Minimum cost of a schema

# Possible graphs schemas (that fail)

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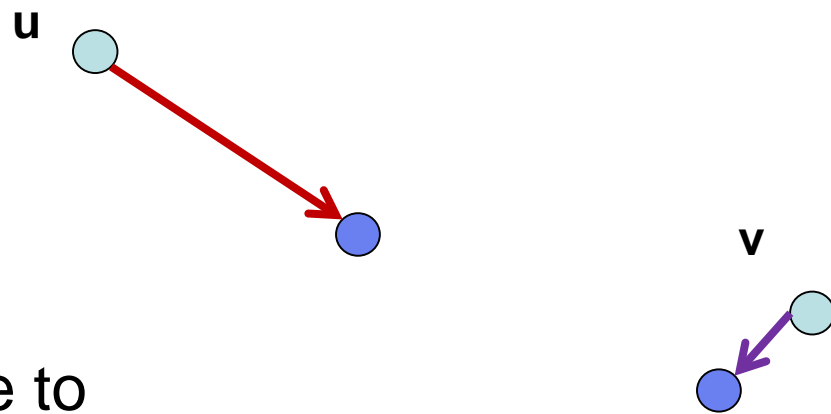
- Pairwise conflicts (the 2-edges of H)

- The two links cannot coexist: One will always be infeasible
- $d(u, v) \leq c \cdot \min(|u|, |v|)$
- Too relaxed : fail feasibility



- Disc graphs

- $d(u, v) \leq c \cdot \max(|u|, |v|)$
- Too conservative
- Only linear approximation



- Solution: Interpolate?

- - How strict do we have to be to maintain feasibility?

# Conflict graph representations [H,Tonoyan, STOC'15]

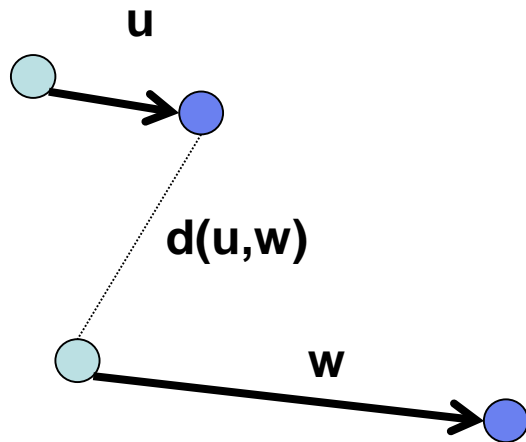
Adjacency predicate:

$$d(u, w) \leq f\left(\frac{|w|}{|u|}\right) |u|,$$

( $f$  monotone)

$f$  linear : disc graphs  
 $f$  const : pairwise SINR

( $w$  is longer than  $u$ )



All such graphs are  $O(1)$ -simplicial,  
which allows for constant-factor  
approximation of our problems

# Conflict graph representations [H,Tonoyan, STOC'15]

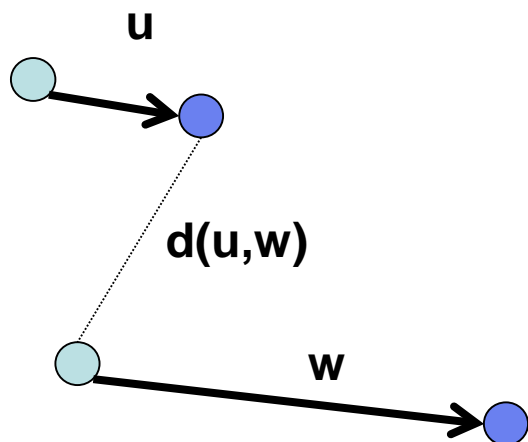
Adjacency predicate:

$$d(u, w) \leq f\left(\frac{|w|}{|u|}\right) |u|,$$

( $f$  monotone)

$f$  linear : disc graphs  
 $f$  const : pairwise SINR

Feasibility holds for  $f(x) = \Omega(\log x)$

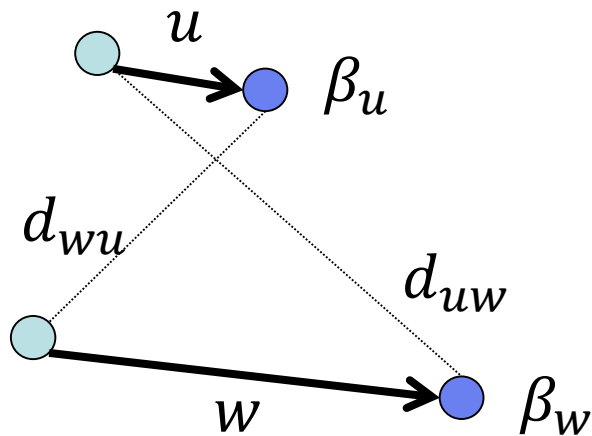


Cost of abstraction is  $f^*(x)$ ,  
the iterated application of  $f$

For  $f = \log$ , the cost is  $O(\log^* \Delta)$   
 $\Delta =$  Diversity in link lengths

# Conflict graph w/ data rates [H,Tonoyan ICALP'17]

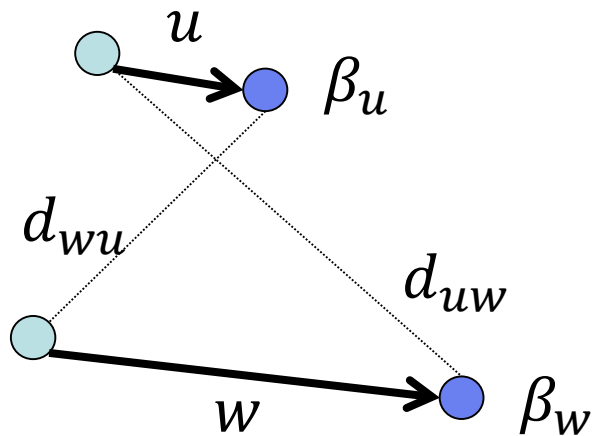
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*High bit-rate means less error tolerance.  
Requires smaller (relative) interference*

*Previous formulation failed to capture this*

# Conflict graph w/ data rates [H,Tonoyan ICALP'17]



Effective length of link  $u$  :  $\ell_u = |u| \cdot \beta_u^{1/\alpha}$

Adjacency predicate:

$$d_{uw}d_{wu} \leq f \left( \frac{\ell_w}{\ell_u} \right) \ell_u \ell_w,$$

(for  $\ell_u \leq \ell_w$ )

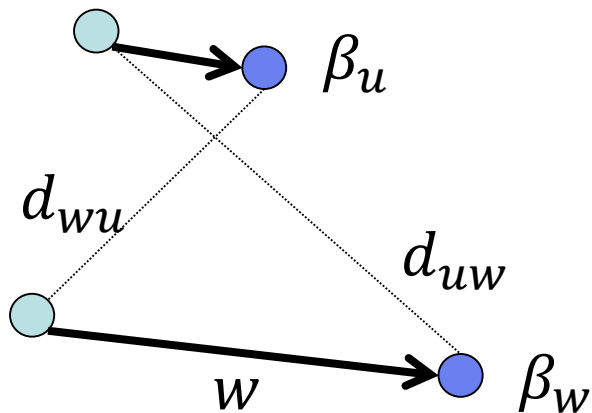


# Conflict graph w/ data rates [H,Tonoyan ICALP'17]

Adjacency predicate:

$$d_{uw}d_{wu} \leq f\left(\frac{|w|}{|u|}\right) |u||w|,$$

( $f$  monotone)



Feasibility achieved with  $f(x) = \sqrt[c]{x}$ ,  
Price of abstraction  $O(\log \log \Delta)$

Achievable with *oblivious* power:  
depends only on link length.

# Stronger sandwiching property

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*Sandwiching property:*

Given hypergraph  $H$ , we form *two* graphs  $G_1$  and  $G_2$  s.t.

For all subsets  $S \subseteq V$ ,

$$\chi(G_1(S)) \leq \chi(H(S)) \leq \chi(G_2(S))$$

*and*

$$\frac{\chi(G_2(S))}{\chi(G_1(S))} = O(\log \log \Delta)$$



# Implications

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- All major scheduling problems solved with  $O(\log \log \Delta)$  factor, involving all available diversity
- Including:
  - Weighted MIS, and capacity region approximation
  - Different fixed rates, and rate control, with arbitrary utilities
  - Multi-channel multi-antennas variants
  - Multi-hop scheduling with fixed paths, or routing
  - Maximum (concurrent) multifold,
  - Fractional scheduling
- Other applications:
  - Online algorithms (admission control, scheduling)
  - Spectrum auctions (additive, submodular, general valuations)
- Followup work: Connectivity & aggregation [\[MoWa06\]](#)

# Limitation results for Conflict graph representations

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- A. Necessarily of the form we consider  $d(u, w) \leq f\left(\frac{|w|}{|u|}\right) |u|$
- B. Incur a  $\Omega(\log \log \Delta)$  factor  $\rightarrow$  Price of abstraction
- B'. Incur a  $\Omega(\log^*(\Delta))$  factor for uniform bit rates
- C. Cannot capture uniform power (= no power control)
- D. Requires Euclidean or doubling metrics
- E. No approximation in terms of  $n$  is possible.
- F. Requires interference-limited networks

# Open questions :

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- What other classes of hypergraphs have effective sketches?
- What can we say about this new class of graphs

# Open questions

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- Handling dynamic situations
- Uniform power
  - Only one power level
  - Should be „easier“, but we understand it less analytically
- Understanding SINR
- New modes of communication (*interference alignment*)
  - Beamforming, MIMO, *cooperative, cancellation,...*

# Collaborators



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(ETH)



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- Marijke  
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