

## Background

- In New York City, about 100,000 students enter public high schools each year.
- How to assign students to schools?

## One-to-Many Matching Model

- Every student  $a \in A$  has a strict **preference** ordering,  $>_a$ , of the schools (possibly incomplete).
- Every school  $b \in B$  has a strict **preference** ordering,  $>_b$ , of the students (possibly incomplete) and a **quota**  $q_b$ .
- Represent an instance as  $(G(A \cup B, E), <, \mathbf{q})$ .

## Objectives

- Stability**
  - no *blocking pairs*, i.e. no student and school that are not assigned to each other would both prefer to be.
- Pareto efficiency (for students)**
  - no assignment where every student is at least as good, and some student is strictly better off.
- Legality** [5]
  - no blocking pair that is *redressable*, i.e. the student and school forming the blocking pair are not matched in any legal assignments.

## Trade-off and Why EADAM

- There is a significant trade-off between stability and efficiency.
- Gale-Shapley [2] outputs a stable assignment that is optimal for the students, but may not be Pareto efficient.
- Efficiency Adjusted Deferred Acceptance Mechanism (EADAM) asks for students' *consent*, as to waive his priority to a certain school if applying only interrupts other students' chance of being admitted, but at no gain to himself.
- If all students consent, output of EADAM is Pareto efficient; otherwise, the output is *constraint efficient* [6]:
  - Pseudo stable**: with consent, it respects all students' priorities.
  - Pseudo efficient**: among all assignments that respect students' priorities, it is optimal for the students.

## What is Known

- The set of legal assignments exists and is unique.
- The set of legal assignments forms a lattice, which has the set of stable assignments as a sublattice.
- The student-optimal legal assignment coincides with the output of EADAM when all students consent, thus is Pareto efficient.

## What is New

- Structural**:
  - The set of legal assignments coincides with the set of stable assignments in a (sub)instance, which we call the *legalized* instance.
- Algorithmic #1**:
  - The legalized instance, the student-optimal legal assignment, and the school-optimal legal assignment can be found in time  $O(|E|)$ .
  - Legal assignment with maximum weight can be found in polynomial time.
- Algorithmic #2**:
  - Output of EADAM with consent, with *any* set of students consenting, can be found in time  $O(|E|)$ .

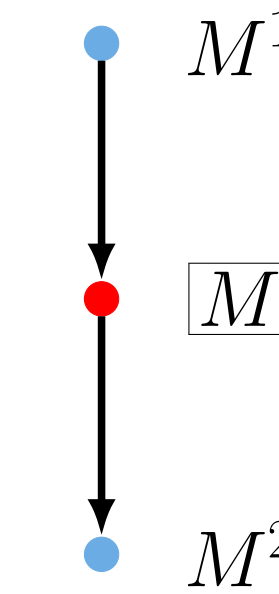
## Techniques

- Generalize *rotations* (trading cycles that preserve stability) to one-to-many settings.
- Jump out of the stable lattice by identifying and removing edges that are not in the legalized instance.
- Construct *rotation digraphs* locally and partially for fast implementation.

## Example

Consider the following instance with 6 students and 3 schools. Each school has a quota of 2.

$$\begin{array}{ll}
 a_1 : \underline{b_2} > b_3 > b_1 & b_1 : \underline{a_1} > \underline{a_4} > \underline{a_3} > a_5 > a_2 > \mathbf{a_6} \\
 a_2 : b_1 > \underline{b_2} > b_3 & b_2 : \underline{a_3} > \underline{a_2} > a_6 > \underline{a_1} > a_5 > a_4 \\
 a_3 : \mathbf{b_3} > \underline{b_1} > b_2 & b_3 : \underline{a_6} > a_1 > \underline{a_5} > a_2 > a_4 > \mathbf{a_3} \\
 a_4 : \underline{b_1} > b_2 > b_3 & & \\
 a_5 : \underline{b_3} > b_2 > b_1 & & \\
 a_6 : \mathbf{b_1} > \underline{b_3} > b_2 & & 
 \end{array}$$

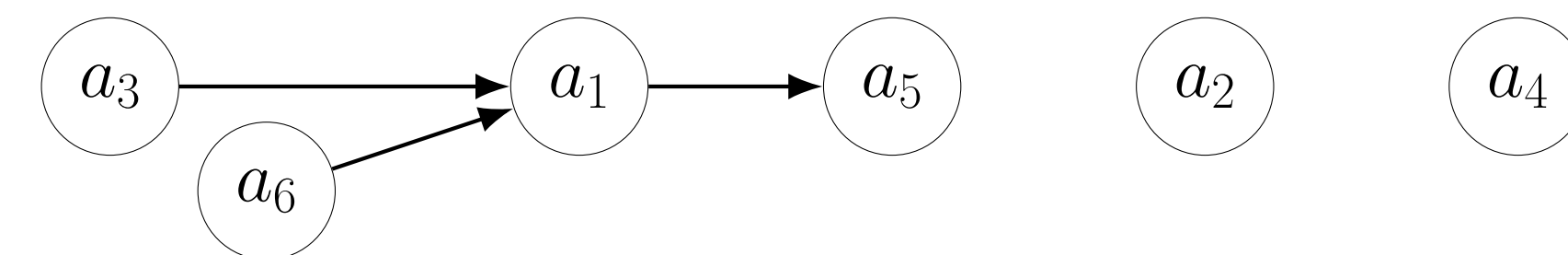


This instance has one stable assignment  $\overline{M} = \{a_1b_2, a_2b_2, a_3b_1, a_4b_1, a_5b_3, a_6b_3\}$ , and two additional legal assignments:  $M^1 = \{a_1b_2, a_2b_2, \mathbf{a_3b_3}, a_4b_1, a_5b_3, \mathbf{a_6b_1}\}$  and  $M^2 = \{\underline{a_1b_1}, a_2b_2, \underline{a_3b_2}, a_4b_1, a_5b_3, a_6b_3\}$ , which can be obtained via ...

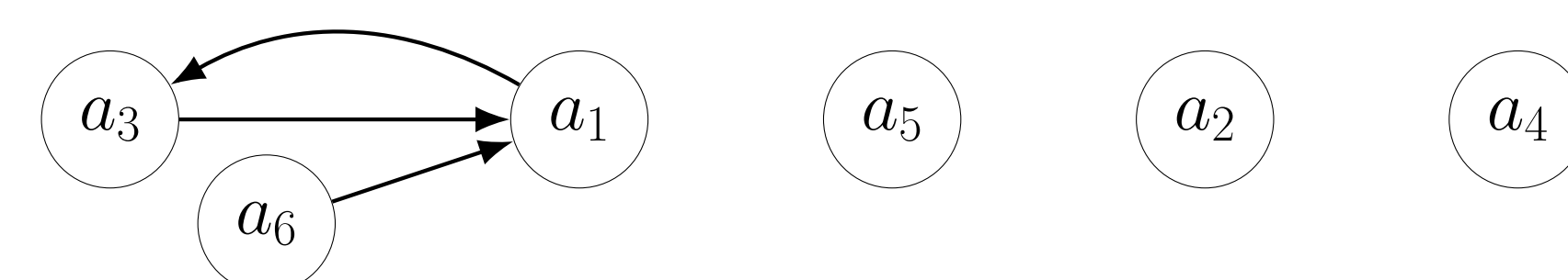
### Rotate-and-Remove

goal: school-optimal legal assignment  $M^2$

- let  $s_M^*(a)$  be the first school  $b \neq M(a)$  on  $a$ 's preference list that prefers  $a$  to some of her assigned students
- point  $a$  to  $s_M^*(a)$ 's least preferred student in  $M$ , as to construct the rotation digraph  $D_A$



- if  $(a', a) \in A(D_A)$  and  $a$  is a sink, remove  $a'M(a)$  from the instance and repeat



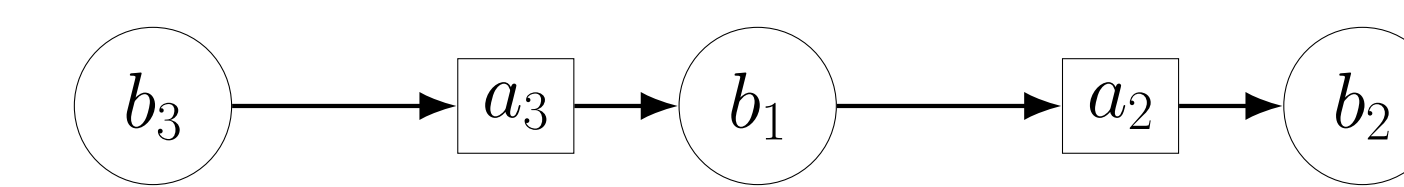
- if  $D_A$  has a cycle  $C$ , for every  $(a', a) \in A(C)$ , reassign  $a'$  to  $M(a)$  to obtain a new assignment,  $M^2$  in this case; repeat

- execute until  $D_A$  only has isolated nodes

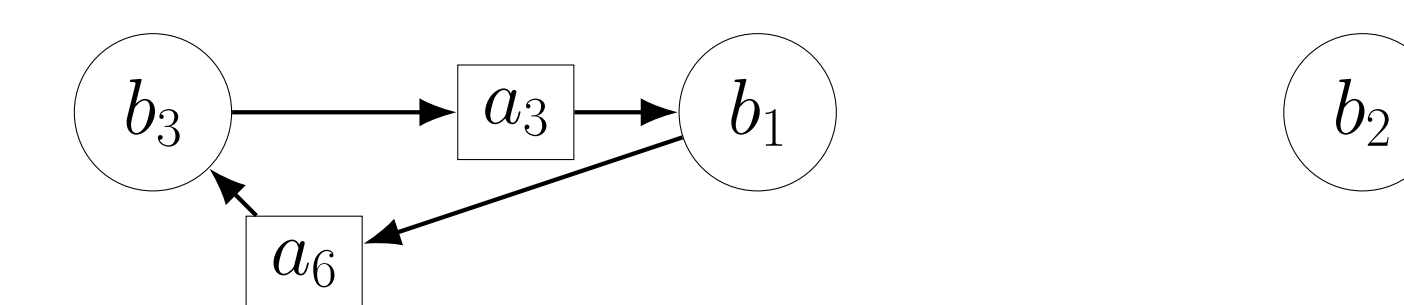
### Reverse Rotate-and-Remove

goal: student-optimal legal assignment  $M^1$

- let  $s_M^*(b)$  be the first student  $a \notin M(b)$  on  $b$ 's preference list that prefers  $b$  to his assigned school
- point  $b$  to  $s_M^*(b)$  and point  $s_M^*(b)$  to  $M(s_M^*(b))$ , as to construct the rotation digraph  $D_B$



- if  $(b', a)$  and  $(a, b) \in A(D_B)$  and  $b$  is a sink, remove  $ab'$  from the instance and repeat



- if  $D_B$  has a cycle  $C$ , for every  $(b', a) \in A(C)$ , reassign  $a$  to  $b'$  to obtain a new assignment,  $M^1$  in this case; repeat

- execute until  $D_B$  only has isolated nodes

## Reverse Rotate-and-Remove with Consent

Fast Implementation of EADAM

- In step 3-1. of **reverse rotate-and-remove**, if  $a$  is nonconsenting, we will additionally remove all edges  $a'b'$  such that  $a >_b a'$ .

Figure 1: All students consent

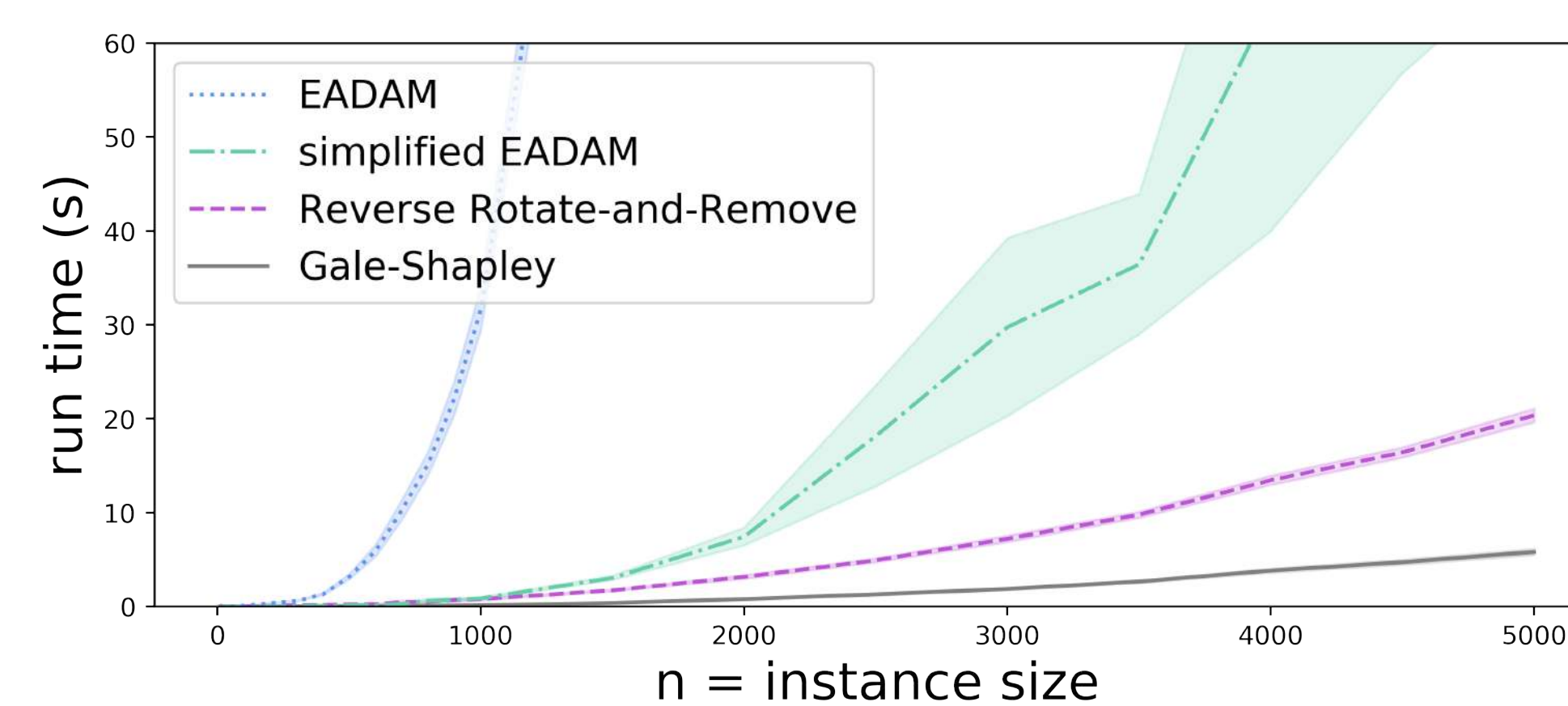
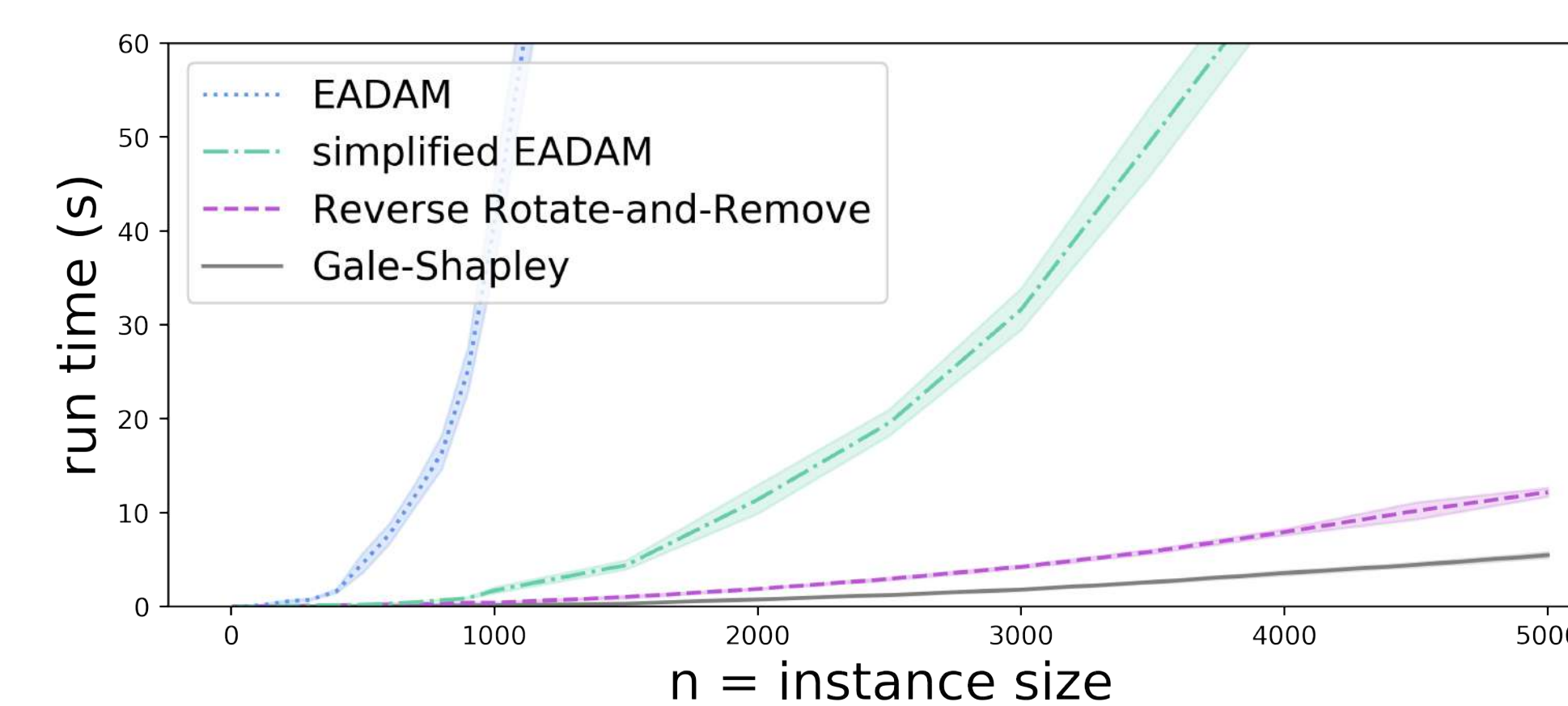


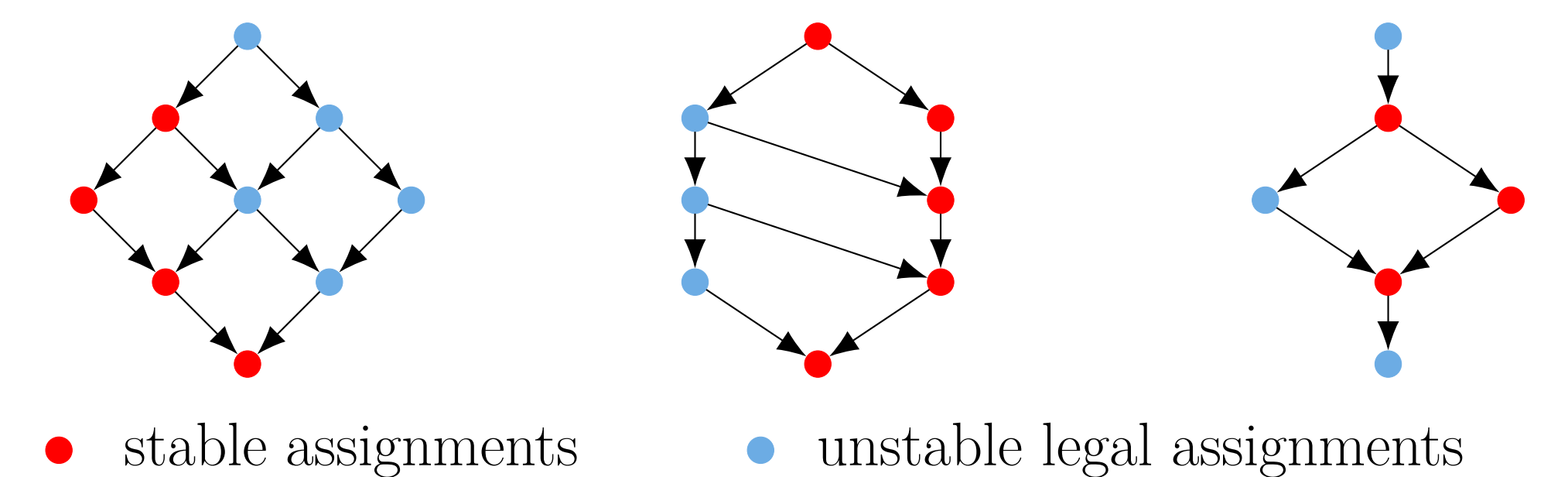
Figure 2: Some students consent



## Lattice

- Stable assignment  $M$  *dominates* stable assignment  $M'$ , denoted by  $M \succeq M'$ , if  $M(a) \geq_a M'(a)$  for every student  $a$ .
- The set of stable assignments  $\mathcal{S}$ , with dominance relation  $\succeq$ , forms a *distributive lattice*, with *join* ( $\vee$ ) and *meet* ( $\wedge$ ):
  - $M_1 \vee M_2 := \{ab : a \in A, b = M_1(a) \vee_{>_a} M_2(a)\}$
  - $M_1 \wedge M_2 := \{ab : a \in A, b = M_1(a) \wedge_{>_a} M_2(a)\}$
- The set of legal assignments  $\mathcal{L}$ , with dominance relation  $\succeq$ , forms a distributive lattice with the same join and meet.

## Examples of Lattices

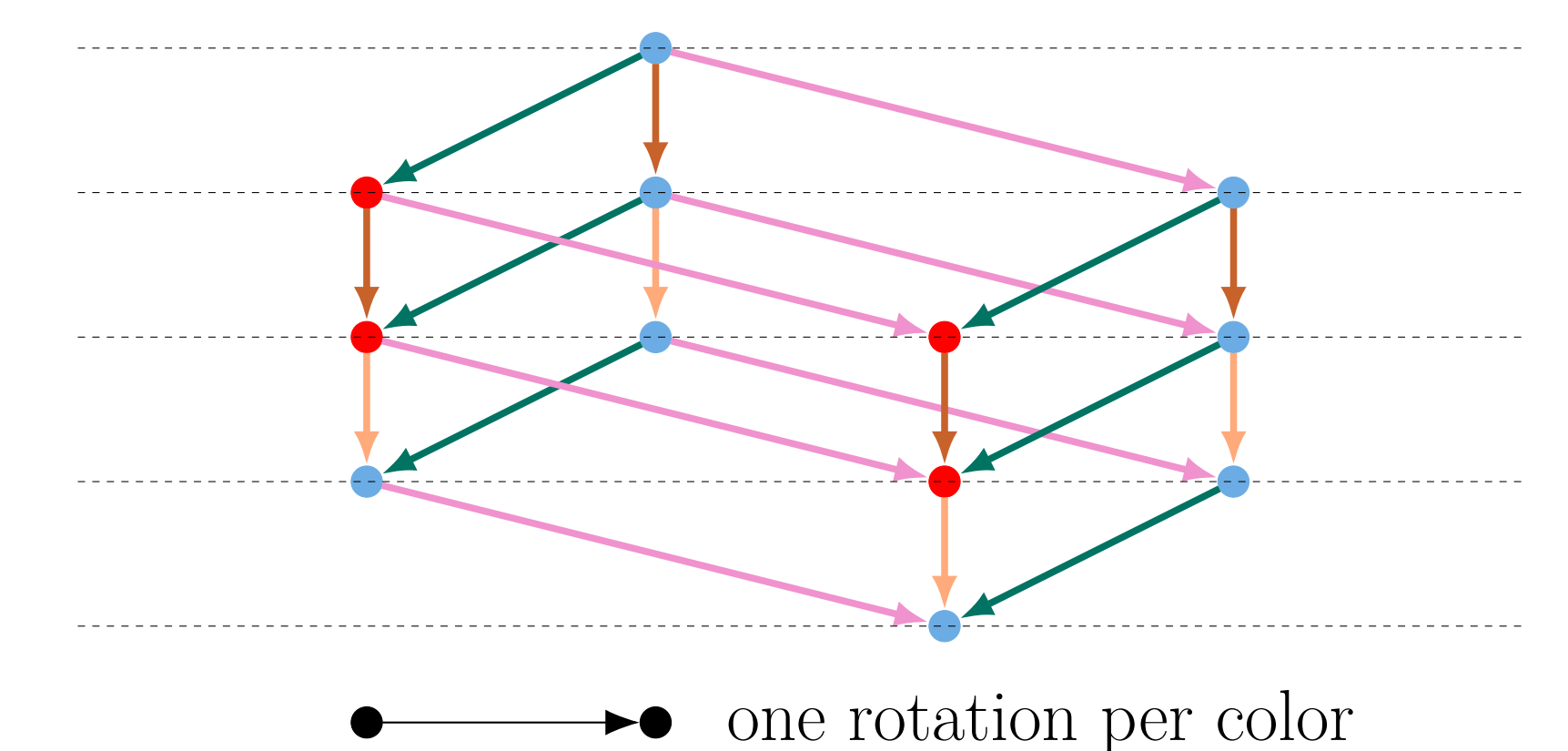


## Rotations

- A cycle  $\rho = b_0, a_0, b_1, a_1, \dots, b_{r-1}, a_{r-1}$  is a *student-rotation exposed* at stable assignment  $M$  if  $a_i b_i \in M$  and  $b_{i+1} = s_M^*(a_i)$  for all  $i$ , with indices taken modulo  $r$ .
- We can move down the lattice via *rotation eliminations*. Obtain an assignment  $M'$  that is immediately below  $M$  in the lattice, by assigning

$$M'(a) = \begin{cases} M(a) & \text{if } a \notin \rho \\ b_{i+1} & \text{if } a = a_i \end{cases}$$

- Every stable assignment can be generated by a sequence of rotation eliminations, starting from the student-optimal stable assignment. Every such sequence contains the same rotations.



- Concepts and results can be extended to school-rotations.

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