## Algorithms for finding all maximal bicliques of a graph

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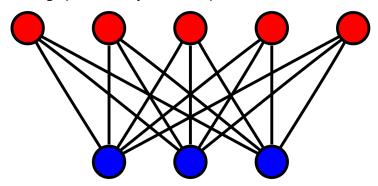
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### Overview

- Graphs and bicliques
  - Basic concept
  - Bicliques
- Algorithms
  - Lexicographic Clique Generation algorithm (LEX)
  - Maximal biclique enumeration algorithm (MBEA)
  - Modular input consensus algorithm (MICA)
- 3 Example
- Graphical user interface (GUI)
- Class diagrams
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## Basic Concept

So, there are graphs and they have bicliques...

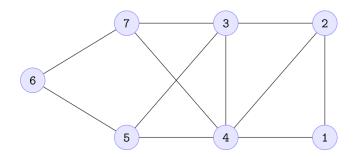


### **Bicliques**

- Maximum Biclique Problem
- Has many applications, including clustering and m

### Example

Compute all maximal bicliques of the following graph:



### Algorithm LEX

- The most basic algorithm
- Relies on two biclique operations:
  - Absorption
  - Consensus Adjunction
- Main idea:
  - a seed list of bicliques is created
  - absorption applied for each biclique against every other biclique
  - consensus adjunction applied to create new bicliques
- non polynomial complexity in both graph size and the number of maximum bicliques!

### Algorithm LEX

Let  $B_1 = (X_1, Y_1)$  and  $B_2 = (X_2, Y_2)$  be two bicliques of G. We say that  $B_1$  absorbs or contains  $B_2$  if  $X_2 \subseteq X_1$  and  $Y_2 \subseteq Y_1$ , or if  $X_2 \subseteq Y_1$  and  $Y_2 \subseteq X_1$ .

If  $Y_1 \cap Y_2 \neq \emptyset$ , we call  $(X_1 \cup X_2, Y_1 \cap Y_2)$  one of the *consensuses* of  $B_1$  and  $B_2$ . Similarly, each of those pairs of subsets  $(X_1 \cap X_2, Y_1 \cup Y_2), (Y_1 \cup X_2, X_1 \cap Y_2), (X_1 \cup Y_2, Y_1 \cap X_2)$  which define bicliques (i.e., which involve two non-empty subsets) are *consensuses* of  $B_1$  and  $B_2$ . In this way, a pair of bicliques may have 0, 1, 2, 3 or 4 consensuses.

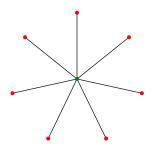
## Algorithm MBEA

(not implemented yet)

## Algorithm MICA

Modular input consensus algorithm (MICA)

- Modular consensus: sequence of operations performed on each pair of bicliques in the repeat loop.
- **Input**: starting with a special input set of maximal bicliques that covers the stars of the graph.



## Algorithm MICA

The algorithm has two steps (n is the number of vertices):

- **Start** with a list  $C_0$  of at most n maximal bicliques that covers the stars of the graph. Let  $C := C_0$ .
- **Repeat**: For every pair of distinct bicliques  $B_1 \in C_0$  and  $B_2 \in C$ , if  $B_1$  and  $B_2$  have a consensus  $B_3$  which is not absorbed by any member of C, then extend  $B_3$  to a maximal biclique  $B_4$ , and add  $B_4$  to C.

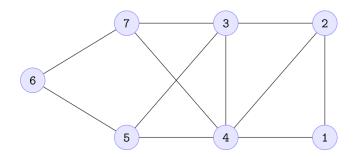
## Algorithm MICA

#### Some subtantial improvements for implementation:

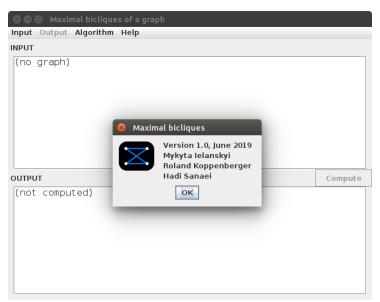
- Many consensus adjunction operations produce the same output.
- $X \subset Vertices : \Gamma(X) := \text{set of vertices adjacent to each vertex in } X$ . For all  $X \subset Vertices : (\Gamma^2(X), \Gamma(X))$  is a maximal biclique.
- Proceed in stages, consider only newly added bicliques in each stage.
- Time complexity: incrementally polynomial, i.e. time for computation of next new maximal biclique is bounded polynomially in number of vertices and number of maximal bicliques computed so far.

## Example

Again: Compute all maximal bicliques of the following graph:



### **GUI**



### **GUI**

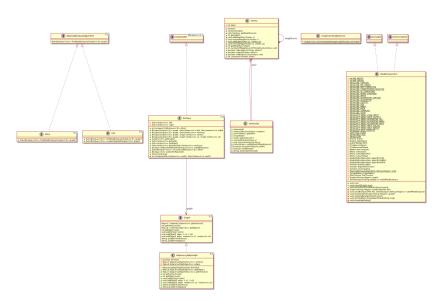
What can one do with the graphical user interface?

- Load a graph from a text file.
- Select an algorithm for computation.
- Compute the set of maximal bicliques.
- Save the result of the computation in a text file.

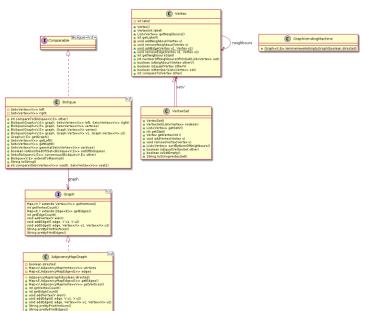
### **GUI**

```
🔞 🖨 🗈 Maximal bicliques of a graph
Input Output Algorithm Help
INPUT
Graph with 6 vertices and 8 edges
 [1, 2, 3, 4, 5, 6]
 [(1, 2), (1, 6), (2, 3), (3, 4), (3, 6), (4, 5), (4, 6), (5, 6)]
OUTPUT
                             Algorithm: MICA
                                                                   Compute
Set of 5 maximal bicliques computed
([3], [2, 4, 6])
([4], [3, 5, 6])
([6], [1, 3, 4, 5])
([1, 3], [2, 6])
 ([3, 5], [4, 6])
```

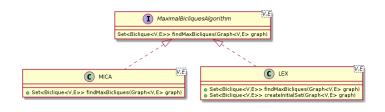
# package bicliques



### package bicliques.graphs



### package bicliques.algorithms



## package bicliques.ui



### Practical demonstration

We conclude with some practical computations.