

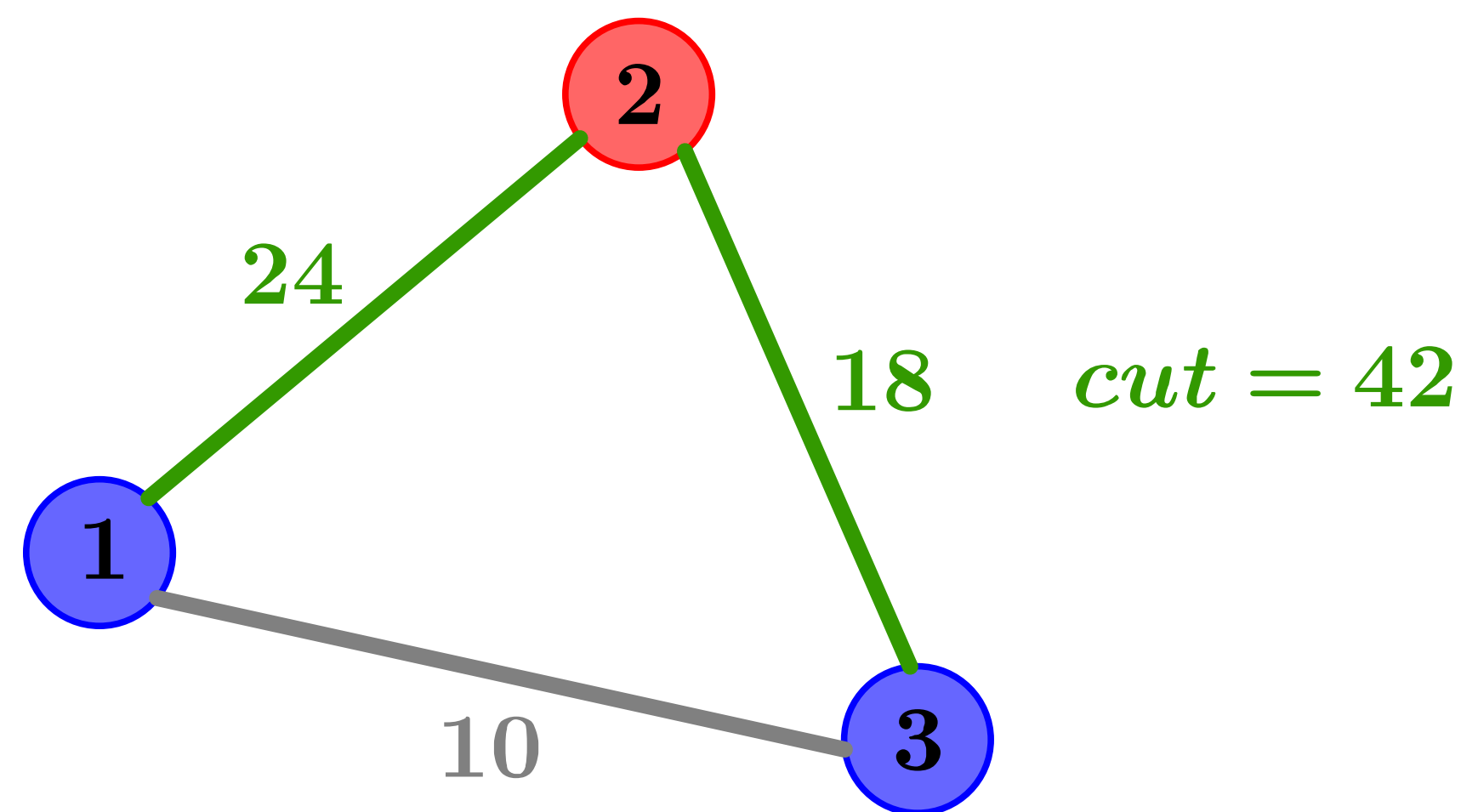
HIGH-PERFORMANCE COMPUTING IN COMBINATORIAL OPTIMIZATION

Elisabeth Gaar⁴, Timotej Hrga¹, Borut Lužar³, Janez Povh^{1,2}, Alen Vegi Kalamar, Angelika Wiegele⁴

University of Ljubljana, Faculty of Mechanical Engineering¹, Institute of Mathematics, Physics and Mechanics²,
Faculty of information studies in Novo mesto³, Alpen-Adria-Universität Klagenfurt⁴

Max-Cut problem

Divide the vertices of the graph G into red and blue such that the sum on edges connecting vertices with different color is maximal.



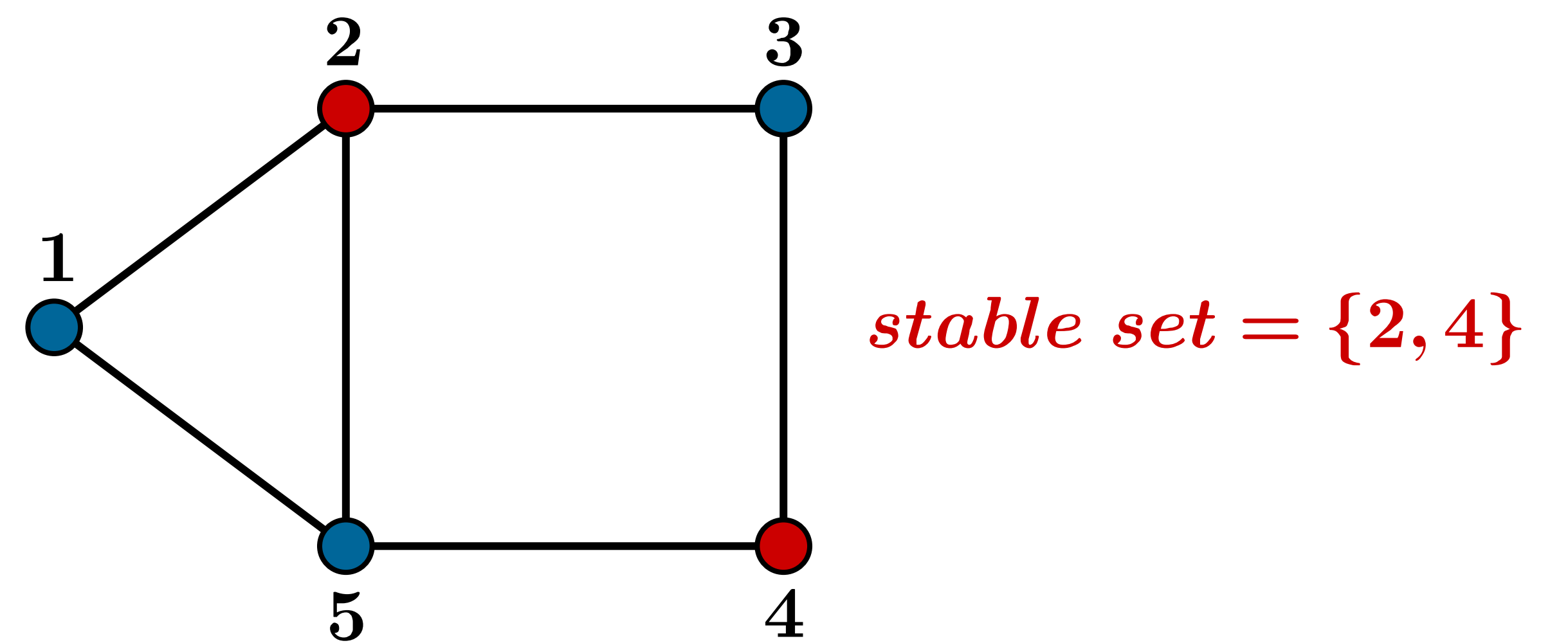
It can be posed as a binary quadratic problem

Max-Cut

$$\begin{aligned} & \text{maximize} && \frac{1}{4}x^T L x \\ & \text{subject to} && x \in \{-1, 1\}^n \end{aligned}$$

Stable Set problem

Find the maximum number of vertices such that no two are connected by an edge.



It can be expressed by an integer linear program:

Maximum Stable Set

$$\begin{aligned} & \text{maximize} && \sum_{v \in V} x_v \\ & \text{subject to} && x_v + x_u \leq 1 \quad \text{for each edge } \{u, v\} \in E, \\ & && x_v \in \{0, 1\} \quad \text{for all } v \in V \end{aligned}$$

Branch & Bound parallel algorithm

MPI (Message Passing Interface) has been used to develop parallel solvers which use a Master/Slave scheme:

Algorithm for MASTER

```
input: graph G
output: optimal solution x
initialize:
  compute initial solution value  $z_{bk}$  and vector  $x_{bk}$ ;
  initialize problem list  $Q$ ;
  send initial problem to first free slave;
while there are working slaves and  $Q \neq \emptyset$  do
  receive message from slave;
  if BRANCH then
    generate new subproblems and put them in  $Q$ ;
  else if PRUNE then
    mark slave as free;
  else if NEW_VALUE then
    slave found better solution;
    update  $z_{bk}$  and  $x_{bk}$ ;
end
send subproblems to free slaves;
end
send message FINISH to slaves;
return  $x_{bk}$ 
```

Algorithm for SLAVE

```
receive message from master;
if FINISH then
  stop;
else
  receive subproblem and best value from master;
  compute lower bound  $z_{lk}$ ;
  compute upper bound  $z_{ub}$ ;
  if  $z_{lk} > \text{best value}$  then
    send message NEW_VALUE to master;
    update best value;
  end
  if  $z_{ub} < \text{best value}$  then
    send message PRUNE to master;
  else
    send BRANCH to master;
  end
end
```

BiqBin solver

1. **Extend** BiqMac solver for Max-Cut developed by Alpen-Adria-Universität Klagenfurt to solve

Binary Quadratic Problem

$$\begin{aligned} & \text{maximize} && x^T Q x + l^T x + c \\ & \text{subject to} && A x = b, \\ & && x \in \{0, 1\}^n \end{aligned}$$

2. **Improve** performance by parallelization.

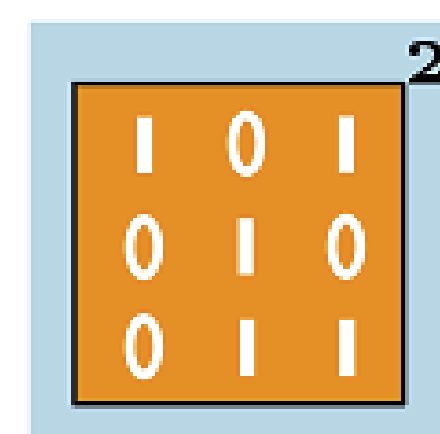
3. **Make** new open-source solver **BiqBin** available online which will run on the high-performance computer owned by the Faculty of Mechanical Engineering in Ljubljana.

Preliminary numerical results

We present the numerical results of the parallel B&B algorithm for Max-Cut tested on graph instances from the *BiqMac Library* and of the parallel B&B algorithm for Stable set tested on *random graphs with different densities*.

The following table summarizes the execution for both serial and parallel implementations. The results show the number of processors used (#proc) and the total time spent in seconds.

graph	serial	parallel		
	#proc = 1	#proc = 24	#proc = 48	#proc = 96
Max-Cut				
pm1d_100.0	7745	391	201	110
pm1s_100.1	404	35	34	34
pw01_100.9	383	36	33	33
g05_100.0	3633	189	103	63
w05_100.0	3799	198	108	69
Stable set				
g150_density5	822	99	50	27
g150_density10	382	152	73	39
g150_density20	414	52	52	52
g150_density30	407	132	132	132
g150_density50	342	322	322	322
g200_density10	more than 2 hours	1347	647	300



High-Performance Solver

for

Binary Quadratic Problems

BiqBin

Financed by

• Austrian Science Fund (FWF): project number I 3199-N31



• Slovenian Research Agency (ARRS): project number N1-0057

