Final exam tutorial:
Thursday Dec. 8 at 12:30pm, Room TBA.

Please remember to fill out your Course Experience Surveys.

I would love to have feedback from everybody!

## Discrete Applied Mathematics

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## Material copied from:

Contribution
Graph domination, tabu search and the football pool problem
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$\pm$ Show more
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## Abstract

We describe the use of a tabu search algorithm for generating near minimum dominating sets in graphs. We demonstrate the effectiveness of this algorithm by considering a previously studied class of graphs, the so-called "football pool" graphs, and improving many of the known upper bounds for this class.
Note: most journal papers are accessible electronically for free through the UVic library.

## Introduction to the tactic:

Glover, F. 1986. Future Paths for Integer Programming and Links to Artificial Intelligence. Computers and Operations Research. Vol. 13, pp. 533-549.

Hansen, P. 1986. The Steepest Ascent Mildest Descent Heuristic for Combinatorial Programming. Congress on Numerical Methods in Combinatorial Optimization, Capri, Italy.

Neighbourhood search algorithms initially impose a neighbourhood structure on the set of configurations X . Starting at a (possibly randomly) chosen element $x_{0}$ the algorithm proceeds by repeatedly moving from a configuration to one of its neighbours, with the ultimate aim of finding a configuration of low cost.

Hill climbing and simulated annealing are two popular neighbourhood search techniques that have had some success in combinatorial problems. Tabu search is a more recent technique.

Tabu - the Polynesian concept of something prohibited from being mentioned or touched.

Tabu search algorithm: a heuristic approach that avoids cycling back to local optima

Tabu Algorithm: Start at any $x_{0}$.
At step i choose $x_{i}$ as a neighbour of $x_{i-1}$ that minimises $c\left(x^{i}\right)$ subject to the constraint that the move from $x_{i-1}$ to $x_{i}$ does not 'undo' any of the $t$ most recent moves. Finish after a number of iterations, returning the $x_{i}$ which gave the least $c\left(x_{i}\right)$.

The tabu list prevents an immediate return to a local minimum, and with luck the search is forced out of the region of attraction of that local minimum.

Maintains a current solution $S$ which is any subset of $V(G)$ (either a dominating set or a partial dominating set.

Each set $S$ has a cost $c(S)=|S|+$ number of vertices not dominated by $S$.

Note that $S$ does not have to be a dominating set but $S$ together with the undominated vertices is a dominating set. The reason for not constraining $S$ to be a dominating set is that this allows paths between small dominating sets which might otherwise need to go via a much larger dominating set.

## For a solution S, the neighbouring

 solutions are obtained by either deleting a vertex in $S$ or adding a vertex not in $S$.Two moves are defined to undo each other if one is addition and the other deletion of the same vertex.

If there are several equally good optimal moves a random choice is made.

For the Tabu list, Rowan and Gordon used Tabu list lengths of between 5 and 8 for most of the runs. The example I give has Tabu list size 3.

A very simple aspiration criterion was also used: if an otherwise tabu move gave an improvement on the best solution found to date, then it was performed anyway.

Trial 0: $S$ is the empty set
0 :
9

1:
8
2: 8
3: 8
4: 7
5: 8
6: 10
7: 8
8: 8


9: 9
10: 8
Minimum cost is 7 for vertex 4

Tria1 1: S= 4
Tabu: 4 -1 -1
Costs of the vertices:
0: 5

1: 5
2: 5
3: 6
5: 7
6: 7
7: 7
8: 6
9: 6
10: 6


Minimum cost is 5 for vertex 0

Trial 2: $\mathrm{S}=0 \mathrm{C}$
Tabu: 4 -1
Costs of the vertices:


2: 6
3: 6
5: 5
6: 5
7: 5
8: 4
9: 4
10: 4
Minimum cost is 4 for vertex 8

Trial 3: $\mathrm{S}=0 \quad 4 \quad 8$ Tabu: 4008 Costs of the vertices:

| 1: | 5 |
| :--- | :--- |
| 2: | 5 |
| $3:$ | 5 |
| 5: | 4 |

6: 4
7: 5

$\begin{array}{rr}\text { 9: } & 5 \\ 10: & 5\end{array}$
Minimum cost is 4 for vertex 5

Smaller dominating set: 0458

Trial 4: $\mathrm{S}=0 \quad 4 \quad 5 \quad 8$ Tabu: 508 Costs of the vertices:
1: 5
3: 5

4: 4
6: 5
7: 5
9: 5
10: 5

Minimum cost is 4 for vertex 4

Trial 5: S= $0 \quad 58$
Tabu: 548
Costs of the vertices:


0: $\quad 6$
2: 4
3: 4
6: 5
7: 5
9: 5
10: 5
Minimum cost is 4 for vertex 1

Trial 6: $\mathrm{S}=0 \quad 1 \quad 5 \quad 8$
Tabu: 541
Costs of the vertices: 0: 3
2: 5
3: 5
6: 5
7: 5
8: 6
9: 5
10: 5
Minimum cost is 3 for vertex
Smaller dominating set: 158

Trial 7: S= $1 \quad 58$
Tabu: 041
Costs of the vertices:
2: 4
3: 4
5: 5

6: 4
7: 4
8: 5
9: 4


10: 4
Minimum cost is 4 for vertex 7 (vertex number chosen randomly from those of min cost).

Choose in advance the number of iterations to do.

Or do this for a given amount of time.
Or do this until it has been a long time with no improvement to the optimal solution and then maybe randomly restart.

You can start with any set $S$.
Maybe $S=V(G)$ is an interesting choice?

