# Faster SAT solving with applications to Sudoku

#### **Background**

 A SAT solver is a program that takes as input a formula in Boolean logic and returns an assignment to the variables that makes the formula true (if one exists).

```
# SAT Solving Example
with(Logic):
F := (a &or b) &and c;
Satisfy(F);
```

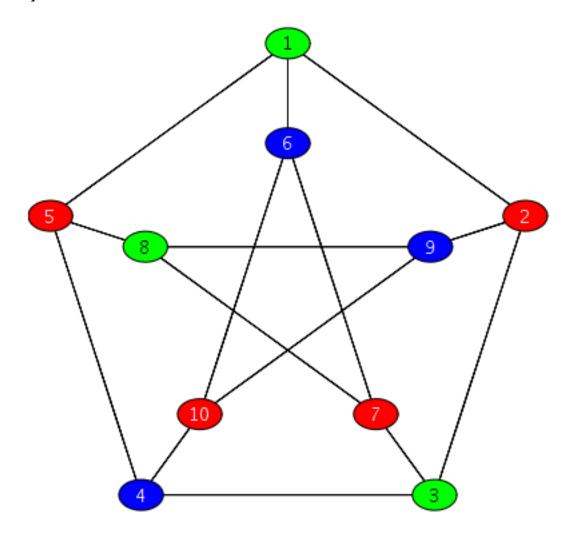
```
F := (a \lor b) \land c\{a = false, b = true, c = true\}
```

- Maple has had a Boolean logic package since at least Maple V but the satisfiability-checking command was slow and only intended to be used on small examples.
- In the meantime there has been a lot of progress in SAT solving techniques—to the point that in many domains it is commonplace for people to translate their problem into SAT just to be able to use a SAT solver on it.
- In Maple 2016, Stephen Forrest updated the Satisfy command to use MiniSat, a free SAT solver that hasn't been updated since 2010 but forms the basis for many current state-of-the-art SAT solvers.
- In Maple 2018, I updated the Satisfy command to use MapleSAT, an improved version of MiniSat developed by Vijay Ganesh's research group at Waterloo that won awards in 2016 and 2017.

## Graph colouring

• The ChromaticNumber command of the GraphTheory package returns

the minimal number of colours necessary to colour a graph such that no two adjacent vertices share the same colour.



- In Maple 2018, I added a *sat* method which solves the problem by translating it into Boolean logic and calling MapleSAT.
- This method solves some benchmarks in seconds that Maple 2017 couldn't solve in an hour.

```
1 G := :-Import("example/DSJC125.1.s6", base = datadir);
2 CodeTools:-Usage(GraphTheory:-ChromaticNumber(G));
```

 $G \coloneqq Graph \ 1$ : an undirected unweighted graph with 125 vertices and 736 edge(s) memory used=283.87KiB, alloc change=8.75MiB, cpu time=233.00ms, real time=6.37s, gc time=151.28ms

- Profiling revealed that MapleSAT was much faster than Maple's legacy solver but there was a significant amount of overhead in the Maple ↔ MapleSAT link.
- The link was not written for performance: it was based on passing a string to MiniSat.
- In one example with ~37,000 clauses, translating the formula to a string took 1.85s and finding a satisfying assignment took 0.007s.
- Not acceptable especially if you want to call the solver many times.

## Improved MapleSAT link

- Instead of passing a string we pass a Maple object and have MapleSAT internally convert it into the format it uses.
- With the new link the formula from above is passed to MapleSAT and solved in 0.03s.

#### Improved Tseitin

- MapleSAT requires formulas to be in conjunctive normal form. This conversion is done with Maple's Tseitin function.
- Previously Tseitin would always first convert its input into negation normal form, even if it was unnecessary. A check has been added so that Tseitin will check if a formula is in CNF before converting to negation normal form.
- Calling Tseitin on the formula from above previously took about 0.7s, it now takes about 0.1s.

#### Maximum clique

- I added a sat method to the MaximumClique command of the GraphTheory package that finds a maximum clique using a SAT solver.
- I also added a hybrid method that uses the Grid package to run both the default method and the SAT method in parallel and returns the first result.

#### **Timings**

 Timings comparing the hybrid, SAT, and default methods with a timeout of 200 seconds:

BENCHMARK HYBRID SAT DEFAULT

c-fat500-1	2.519	6.202	0.121
keller4	9.059	7.643	TIMEOUT
p_hat500-1	33.122	TIMEOUT	31.566
MANN_a9	1.539	0.157	186.845
brock200_2	21.13	23.35	19.388
c-fat200-2	1.573	2.077	0.143
c-fat200-5	9.559	7.785	17.913
johnson8-2-4	1.076	0.06	0.011
c-fat500-10	122.164	114.125	TIMEOUT
johnson8-4-4	1.556	0.241	6.029
c-fat200-1	1.536	0.725	0.053
hamming6-4	1.13	0.068	0.047
hamming8-2	54.097	49.863	TIMEOUT
johnson16-2-4	7.092	5.575	TIMEOUT
hamming8-4	9.584	7.81	TIMEOUT
p_hat300-1	3.568	11.891	2.351
c-fat500-5	38.588	35.405	117.546
p_hat700-1	163.249	TIMEOUT	151.535
c-fat500-2	2.077	8.936	0.777
hamming6-2	2.054	0.613	40.838

- The SAT method was the fastest for half of the solved benchmarks and solved 18/80 benchmarks compared to the default method's 15/80 benchmarks.
- The hybrid method solved 20/80 benchmarks but was usually the second fastest method.

## Example worksheets

- In addition to the clique-finding example worksheet, I also wrote worksheets for
- \* The *n*-queens problem
- \* Solving the world's hardest Sudoku
- \* Solving the Einstein riddle
- \* Solving the 8-puzzle
- \* An interactive Sudoku game