# A SAT-based Resolution of Lam's Problem 

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# We solve Lam's problem from geometry by generating verifiable proofs with satisfiability (SAT) solvers and computer algebra. 

## Computer Science team solves centuries-old math problem

And they had to search through a thousand trillion combinations to do it

## Simply put. . .

Whew! To complete a mathematical investigation as complicated as the one recently accomplished by a team from the faculty of Engineering and Computer Science, every human being on earth would have to do 50,000 complex calculations.

The team, made up of Computer Science's Clement Lam, John McKay, Larry Thiel and Stanley Swiercz, took three years to solve a problem which had stumped mathematicians since the 1700 s.

The problem: To find out whether "a finite projective plane of the order of 10 " can exist.

The answer: "No."
So far it seems simple. But the reality is far different. The Concordia team had to search through $1,000,000,000,000,000$ (that's a thousand trillion) combinations using one of the fastest supercomputers on earth to arrive at a solution.

The problem is so complex that the only way another party could prove the team's answer would be to do the calculations all over again - something which only the most intrepid investigators would even contemplate. The problem has already taken up the lifetimes of many eminent mathematicians.

The particular skill required was in organizing and programming the computer rather than in formulating the equations themselves.

The skills which the team gained while solving the problem have future applications in developing communications networks and cryptography.

Charles Bêlanger


Let's see, if we added up the IQs of Concordia's crack Computer Science team, the number, though not in the trillions, would still be pretty high. Members of the team are (left to right) Larry Thiel, John McKay, Stanley Swiercz and Clement Lam.

## SAT:

## Boolean satisfiability problem

## Effectiveness of SAT solvers

Surprisingly, many problems that have nothing to do with logic can be effectively solved by translating them into Boolean logic and using a SAT solver:

- Discrete optimization
- Hardware and software verification
- Proving/disproving conjectures


Additionally, SAT solvers produce unsatisfiability certificates when no solutions exist.

## CAS:

## Computer algebra system

## Effectiveness of CASs

Computer algebra systems can perform calculations and manipulate expressions from many branches of mathematics:

- Row reducing a matrix
- Determining if graphs are isomorphic
- Computing the symmetries of combinatorial objects


For example, the symmetry group of this graph has generators $(25),(38)(47)$, and $(12)(34)(56)(78)$.

# SAT + CAS 

## Search + Math

## MathCheck: A SAT+CAS system

We've used MathCheck to construct many kinds of combinatorial objects (see uwaterloo.ca/mathcheck).


Hadamard 160 in Cool Tones

Projective Geometry

## History



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In the 1800s it was realized this is impossible!

## Projective geometries

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All projective geometries with a finite number of points have been classified-except for those with exactly two dimensions (the projective planes).

## Projective planes: Examples

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- Every pair of lines meet at a unique point.
- Every pair of points define a unique line.
- Every line contains $n+1$ points for some order $n$.


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order 2

order 3


## Projective planes of small orders

$$
\begin{array}{llllllllll}
1 & 2 & 3 & 4 & 5 & 6 & 7 & 8 & 9 & 10 \\
\checkmark & \checkmark & \checkmark & \checkmark & \checkmark & \checkmark & \checkmark & \checkmark
\end{array}
$$

## Projective planes of small orders

# $\begin{array}{llllllllll}1 & 2 & 3 & 4 & 5 & 6 & 7 & 8 & 9 & 10 \\ \checkmark & \checkmark & \checkmark & \checkmark & \checkmark \\ \times & \checkmark & \checkmark & \checkmark & ?\end{array}$ 

Theoretical obstruction

## Projective planes of small orders

# $\begin{array}{llllllllll}1 & 2 & 3 & 4 & 5 & 6 & 7 & 8 & 9 & 10\end{array}$ $\checkmark$ $\checkmark$ <br>  $\checkmark$ ک $\times$ <br> <br> $\checkmark$ <br> <br> $\checkmark$ <br>  

No such plane known
No theoretical obstruction known

## Projective planes of small orders

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<td style="text-align: left; border-left: none !important; border-right: none !important; border-bottom: none !important; border-top: none !important; width: auto; vertical-align: middle; ">4</td>
<td style="text-align: left; border-right: none !important; border-bottom: none !important; border-top: none !important; width: auto; vertical-align: middle; ">5</td>
<td style="text-align: left; border-bottom: none !important; border-top: none !important; width: auto; vertical-align: middle; ">6</td>
</tr>
<tr style="border-top: none !important; border-bottom: none !important;">
<td style="text-align: left; border-left: none !important; border-right: none !important; border-bottom: none !important; border-top: none !important; width: auto; vertical-align: middle; ">$\checkmark$</td>
<td style="text-align: left; border-right: none !important; border-bottom: none !important; border-top: none !important; width: auto; vertical-align: middle; ">$\checkmark$</td>
<td style="text-align: left; border-bottom: none !important; border-top: none !important; width: auto; vertical-align: middle; ">$x$</td>
</tr>
<tr style="border-top: none !important; border-bottom: none !important;">
<td style="text-align: left; border-left: none !important; border-right: none !important; border-bottom-style: solid !important; border-bottom-width: 1px !important; border-top: none !important; width: auto; vertical-align: middle; " class="_empty"></td>
<td style="text-align: left; border-right: none !important; border-bottom-style: solid !important; border-bottom-width: 1px !important; border-top: none !important; width: auto; vertical-align: middle; " class="_empty"></td>
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</tr>
</tbody>
</table>
<table-markdown style="display: none">| 4 | 5 | 6 |
| :--- | :--- | :--- |
| $\checkmark$ | $\checkmark$ | $x$ |
|  |  |  |</table-markdown></div> $\begin{array}{lll}8 & 9 \\ \checkmark \\ \checkmark & ?\end{array}$ 

Somehow, this problem has a beauty that fascinates me as well as many other mathematicians.

Clement Lam


## Lam's problem

The first critical value of $n$ is $n=10$. A thorough investigation of this case is currently beyond the facilities of computing machines.


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Marshall Hall Jr.
Finite Projective Planes 1955

Could computers resolve Lam's problem?

## Incidence matrix encoding

The incidence matrix of a projective plane is a $\{0,1\}$ matrix encoding which lines (rows) contain which points (columns):


Each row contains exactly $n+1$ ones (in order $n$ ).
The inner product of any two rows or columns is exactly 1 .

## Enter coding theory

The code generated by a projective plane is the row space of its incidence matrix over $F_{2}=\{0,1\}$.

The weight of a $\{0,1\}$ word is the number of 1 s it contains.

## A theoretical breakthrough



> In 1970, Assmus proved strong properties about how many words of each weight must exist in the code generated by a hypothetical projective plane of order ten.

In particular, the code must contain words of weight 15,16 , or 19.

## Searches for codewords

A number of searches performed in the twentieth century found no codewords of weight 15,16 , and 19:

| Weight | Year | Time $^{1}$ | Authors |
| :---: | :---: | ---: | :---: |
| 15 | 1973 | 2 h | MacWilliams et al. |
| 16 | 1974 | $1,300 \mathrm{~h}$ | Carter |
| 19 | 1986 | $1,900 \mathrm{~h}$ | Lam et al. |
| 1989 | $320,000 \mathrm{~h}$ | Lam et al. |  |


${ }^{1}$ Estimated time on a VAX machine (one million instructions per second).

## Correctness of the result

These searches used custom-written software run once on a single piece of hardware. We must simply trust the searches ran to completion.

This is a lot of trust. The authors were upfront that mistakes were a real possibility.

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We found discrepancies with the intermediate results of Lam et al. and an independent search of Roy in 2011.

Nonexistence Certificates

## Nonexistence certificates

We provide certificates that an independent party can use to verify the nonexistence of a projective plane of order ten.

The certificates rely on an encoding of the existence problem into Boolean logic.

## SAT encoding

Each entry in the incidence matrix is represented by a Boolean variable which is true exactly when the entry contains a 1.

How should the projective axiom be encoded in Boolean logic?

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How should the projective axiom be encoded in Boolean logic?

Every pair of lines meet exactly once, therefore:

1. Every pair of lines meet at most once.
2. Every pair of lines meet at least once.

## 1. Lines meet at most once

Consider the following two lines (grey entries unknown) as an example:


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The highlighted entries cannot both be true or the lines would meet more than once.

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In Boolean logic:

$$
\neg a \vee \neg b
$$

## 2. Lines meet at least once

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At least one of the highlighted entries must be true for the lines to meet.

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Consider the following two lines (grey entries unknown) as an example:


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In Boolean logic:

$$
a \vee b \vee c \vee d \vee e \vee f
$$

## Isomorphism Blocking

## CAS isomorphism blocking

The SAT solver finds partial solutions and sends them to a CAS...


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The SAT solver finds partial solutions and sends them to a CAS...

... and the CAS finds a nontrival isomorphism and blocks it.

## Results

We generated certificates demonstrating the nonexistence of words of each required weight:

| Weight | Compute time | Certificate size | Appearing |
| :---: | :---: | :---: | :---: |
| 15 | 7 seconds | 35 MiB | AAECC 2020 |
| 16 | 30 hours | 325 GiB | IJCAI 2020 |
| 19 | 24 months | 110 TiB | AAAI 2021 |

Our searches also completed the fastest-in 2011, a search for weight 16 words required 16,000 hours.

## Necessary trust

To believe this nonexistence result you now need to trust:

- The SAT encoding and script to generate the SAT instances.
- The proof verifier.
- The isomorphism blocking clauses-generated with the symbolic computation library nauty.


## Conclusion

Many mathematical problems stand to benefit from fast, verifiable, and expressive search tools.

Requires some knowledge of SAT and CAS—but avoids using special-purpose search code that is

- hard to write,
- even harder to make efficient,
- and extremely difficult to verify.


## Future work

I'm actively looking for students and collaborators to extend and apply this paradigm to new applications.

Please get in touch if interested (and pass on the word to those who may be)!

Thank you!<br>curtisbright.com

