

How Computers prove Theorems and why it Matters

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What is a Computer?

- ① In 1797 oder even in 1950 it would be a Person:

Factores ab uno usque quibusdam

(a) Prime number table by Felkel-Vega (1797)



(b) Human computers (1950)

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- 1 In 1797 oder even in 1950 it would be a Person:

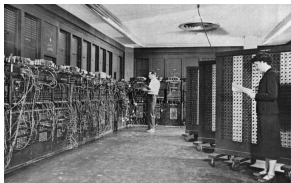
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50	50	50	50	50	50	50	50	50	50	50	50	50	50	50	50	50	50	50	50

(a) Prime number table by Felkel-Vega (1797)



(b) Human computers (1950)

- 2 Starting from the 40s it slowly becomes an electronic device.



(a) ENIAC (1945)

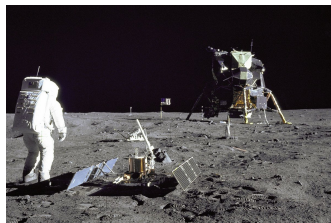


(b) IBM Blue Gene (2006)

Computers in Science



(a) Harvard Computers (1890)

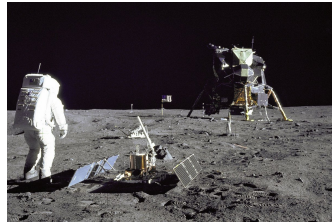


(b) Apollo Guidance Computer (1969)

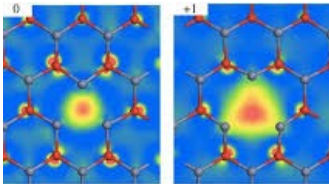
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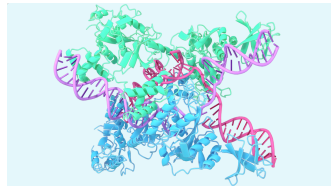
(a) Harvard Computers (1890)



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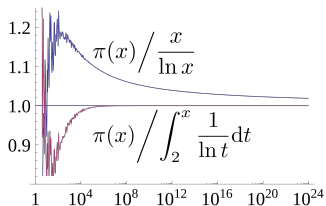
(c) CASTEP (1990)



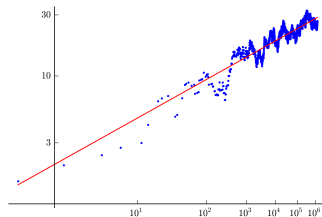
(d) AlphaFold (2018)



Computers in Mathematics

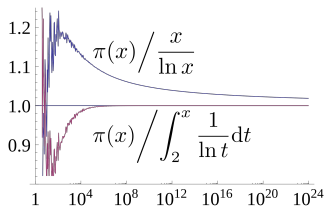


(a) Prime number theorem (1798)

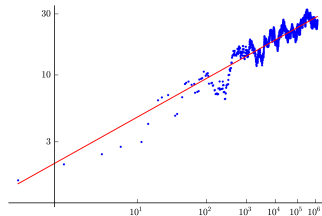


(b) Birch and Swinnerton-Dyer conjecture (1965)

Computers in Mathematics



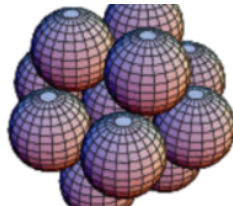
(a) Prime number theorem (1798)



(b) Birch and Swinnerton-Dyer conjecture (1965)



(c) Four color theorem (1967)



(d) Kepler conjecture (1998)

Something is missing: Proofs!

Computers have many applications:

- 1 Computation
- 2 Conjecture
- 3 Proofs through checking finite cases

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What is missing?

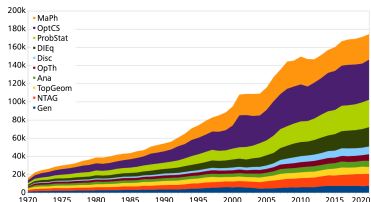
- Proofs!

Questions:

- 1 Can computers prove things and how?
- 2 Can computers automate proofs?
- 3 Can computers prove new theorems?

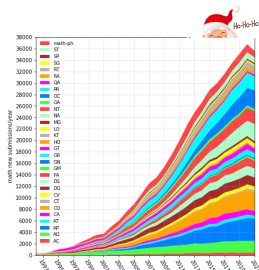
Why should Computers prove things?

1 There is more mathematics:



Actively publishing persons 1970 - 2020

Klaus Hulek, Olaf Teschke. How do mathematicians publish? EMS Mag. 129



Number of math papers on arXiv

https://info.arxiv.org/help/stats/2021_by_area/index.html

Losing oversight, but more suitable for ML algorithms!

- 2 Intricate computations cannot be checked.
- 3 Math is more complicated: we can make more mistakes.

2 Examples

1 Homotopy Hypothesis: Voevodsky¹

- Published Proof by Voevodsky and Kapranov in 1991
- Counter example by Simpson in 1998
- No concrete mistake found until 2013

"A technical argument by a trusted author, which is hard to check and looks similar to arguments known to be correct, is hardly ever checked in detail."

2 Condensed Mathematics: Scholze²

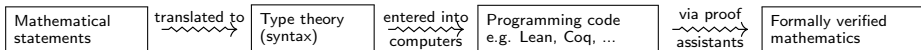
- Complicated proof, hard to check
- Motivated *Liquid Tensor Experiment*

"I learnt that it can now be possible to take a research paper and just start to explain lemma after lemma to a proof assistant, until you've formalized it all! I think this is a landmark achievement."

¹ <https://www.ias.edu/ideas/2014/voevodsky-origins>

² <https://xenaproject.wordpress.com/2020/12/05/liquid-tensor-experiment/>

How can a Computer proof something?



How can a Computer proof something?

Mathematical
statements

translated to

Type theory
(syntax)entered into
computersProgramming code
e.g. Lean, Coq, ...via proof
assistantsFormally verified
mathematics

Example

For all sentences p, q, r we have: $p \wedge (q \vee r) \leftrightarrow (p \wedge q) \vee (p \wedge r)$

```
example (p q r : Prop) : p ∧ (q ∨ r) ↔ (p ∧ q) ∨ (p ∧ r) := by
  apply Iff.intro
  . intro h
    apply Or.elim (And.right h)
    . intro hq
      apply Or.inl
      apply And.intro
      . exact And.left h
      . exact hq
    . intro hr
      apply Or.inr
      apply And.intro
      . exact And.left h
      . exact hr
  . intro h
    apply Or.elim h
    . intro hpq
      apply And.intro
      . exact And.left hpq
      . apply Or.inl
        exact And.right hpq
    . intro hpr
      apply And.intro
      . exact And.left hpr
      . apply Or.inr
        exact And.right hpr
```



But is there Formalization of real Mathematics?

Here are some recent developments:

- 1 **Number theory:** Fermats Last Theorem, since 2024³
- 2 **Analysis:** Carleson's Theorem, since 2024⁴
- 3 **Algebra:** Liquid Tensor Experiment, 2020 - 2022⁵
- 4 **Geometry:** Sphere Eversion, 2020 - 2022⁶
- 5 **Topology:** Homotopy group $\pi_4(S^3)$, 2016 - 2022⁷
- 6 **Geometry:** Kepler conjecture, 2003 - 2015⁸

3
<https://github.com/ImperialCollegeLondon/FLT>

4
<https://github.com/fpvandoorn/carleson>

5
<https://github.com/leanprover-community/lean-liquid>


6
<https://github.com/leanprover-community/sphere-eversion>

7
<https://github.com/agda/cubical/tree/master/Cubical/Homotopy/Group/Pi4S3>

8
<https://github.com/flyspeck/flyspeck>

Where can this lead us?

- 1 Journal Submission with Formalization⁹
- 2 Automatic Proofs via AI¹⁰
- 3 Applications in Teaching^{11,12,13,14,15}



```

import Verbose.English.ExampleLib
import Verbose.English.Statements

set_option verbose.suggestion_widget true

Exercise "Continuity implies sequential continuity"  declaration uses 'sorry'
Given: (f : ℝ → ℝ) (u : ℕ → ℝ) (x₀ : ℝ)
Assume: (hu : u converges to x₀) (hf : f is continuous at x₀)
Conclusion: (f ∘ u) converges to f x₀
Proof:
Let's prove that  $\forall \epsilon > 0, \exists N, \forall n \geq N, |(f \circ u) n - f x_0| \leq \epsilon$ 
Fix  $\epsilon > 0$ 
By hf applied to  $\epsilon$  using that  $\epsilon > 0$  we get  $\delta$  such that  $(\delta\_pos : \delta > 0) (h\delta : \forall (x : \mathbb{R}), |x - x_0| \leq \delta \rightarrow |f x - f x_0| \leq \epsilon)$ 
By hu applied to  $\delta$  using that  $\delta > 0$  we get  $N$  such that  $hN : \forall n \geq N, |u n - x_0| \leq \delta$ 
Let's prove that  $N$  works:  $\forall n \geq N, |(f \circ u) n - f x_0| \leq \epsilon$ 
sorry
QED

```

```

Tactic state
1 goal
f : ℝ → ℝ
u : ℕ → ℝ
x₀ : ℝ
hu : u converges to x₀
hf : f is continuous at x₀
ε : ℝ
ε_pos : ε > 0
δ : ℝ
δ_pos : δ > 0
hδ : ∀ (x : ℝ), |x - x₀| ≤ δ → |f x - f x₀| ≤ ε
N : ℕ
hN : ∀ n ≥ N, |u n - x₀| ≤ δ
⊢ ∀ n ≥ N, |(f ∘ u) n - f x₀| ≤ ε

Suggestions
Use shift-click to select sub-expressions.

```

- 9 <https://xenaproject.wordpress.com/2023/11/04/formalising-modern-research-mathematics-in-real-time/>
- 10 <https://deepmind.google/discover/blog/ai-solves-imo-problems-at-silver-medal-level/>
- 11 <https://impermeable.github.io/>
- 12 <https://gihanmarasingha.github.io/modern-maths-pages/>
- 13 <https://cs22.io/>
- 14 <https://hhu-adam.github.io/>
- 15 <https://github.com/PatrickMassot/lean-verbose>

What does that mean for me?

Here are some possible first steps:

- 1 Stay updated.
 - Keep track of milestones: LTE¹⁶, AlphaProof¹⁷, ...
 - Formalization at (German) universities: Bonn¹⁸, Düsseldorf¹⁹
- 2 Try Lean.²⁰
- 3 Formalize couple first definitions, lemmas in your area of research.
- 4 Integrate formalization into teaching (e.g. exercises).
- 5 Formalize a major theorem.

If there are questions, please ask!

¹⁶ <https://leanprover-community.github.io/blog/posts/lte-final/>


¹⁷ <https://deepmind.google/discover/blog/ai-solves-imo-problems-at-silver-medal-level/>

¹⁸ <https://florisvandoorn.com/>

¹⁹ <https://hhu-adam.github.io/>

²⁰ <https://adam.math.hhu.de/#/g/leanprover-community/nng4>

Formalization in Lean

How many  ?

Demonstration