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# Can we mechanically check any mathematical proof?

Laurent Théry  
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# Mathematics and Computer

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Mathematics

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Mathematics



# Mathematics and Computer

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Mathematics



# Formal Mathematics

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# Formal Mathematics

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## Formal Language



# Formal Mathematics

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## Formal Language

function:  $x + y$

predicate:  $prime(x)$

relation:  $x = y$

logical connective:  $\wedge, \vee, \Rightarrow, \Leftrightarrow, \neg$

quantifier:  $\forall, \exists$





# Formal Mathematics

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## Formal Language

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## Example

$$\forall nxyz, x^n + y^n = z^n \Rightarrow xyz = 0 \vee n \leq 2$$

# Formal Proof

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# Formal Proof

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Proof:  
sequence of elementary steps



$$\frac{A \quad B}{A \wedge B}$$

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Proof:  
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Origin:

B. Russell, *Principia Mathematica*

# Pros and Cons

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# Pros and Cons

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Pros:

Simple datastructure





# Pros and Cons

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Pros:

Simple datastructure

Easy to check



# Pros and Cons

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## Pros:

Simple datastructure

Easy to check

Complete check



# Pros and Cons

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## Pros:

Simple datastructure

Easy to check

Complete check



## Cons:

Catch 22

# Pros and Cons

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## Pros:

Simple datastructure

Easy to check

Complete check



## Cons:

Catch 22

De Millo and al.:

*Social processes and proofs*

# Proof Systems

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# Proof Systems

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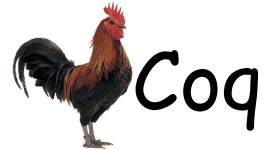
# Proof Systems

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# Proof Systems

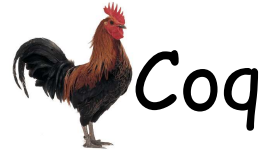
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# Proof Systems

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Coq



Hol



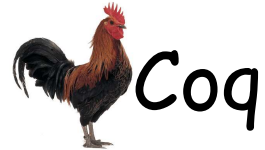
Isabelle



Mizar

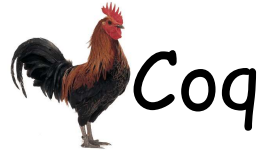
# Proof Systems

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# Proof Systems

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# Some formalisations

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Prime number theorem

$$\pi(x) \sim \frac{x}{\ln x}$$

(Isabelle)

# Some formalisations

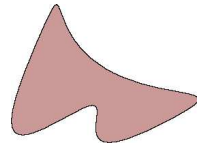
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Jordan curve theorem



(Hol, Mizar)

# Some formalisations

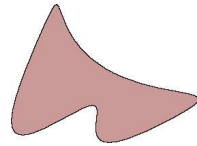
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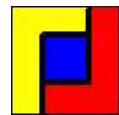
(Isabelle)

Jordan curve theorem



(Hol, Mizar)

Four colour theorem



(Coq)

# What's next?

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# What's next?

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Fermat theorem?

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Fermat theorem?

Poincaré theorem?

# What's next?

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Fermat theorem?

Poincaré theorem?

...

# Mexican hats

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# Mexican hats

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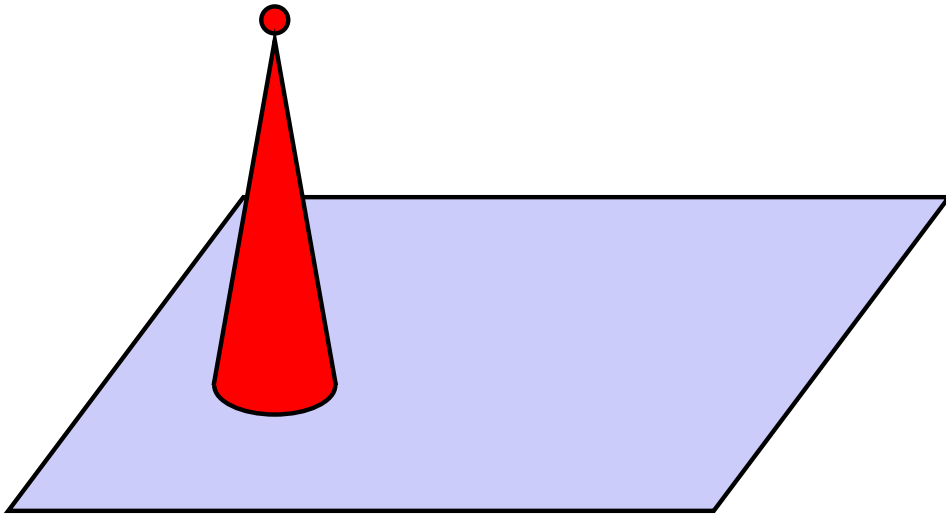
# Mexican hats

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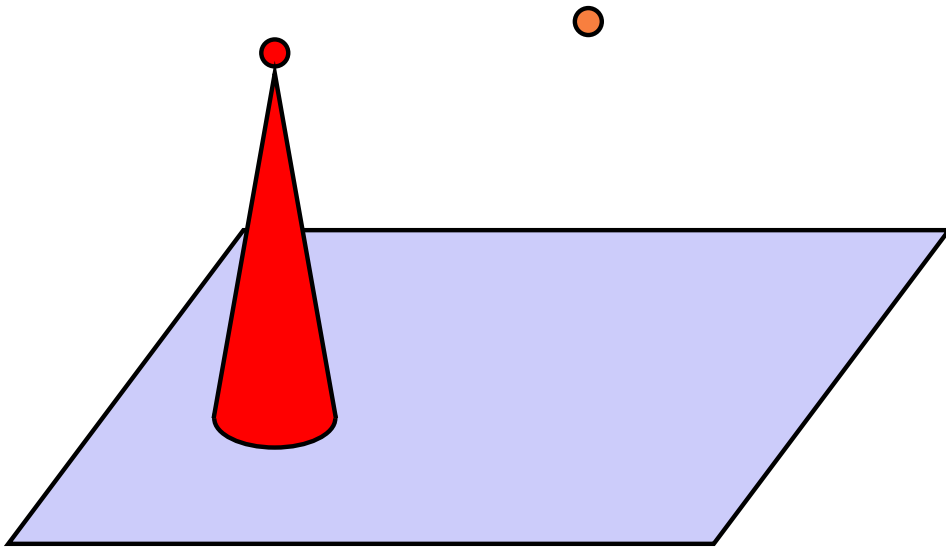
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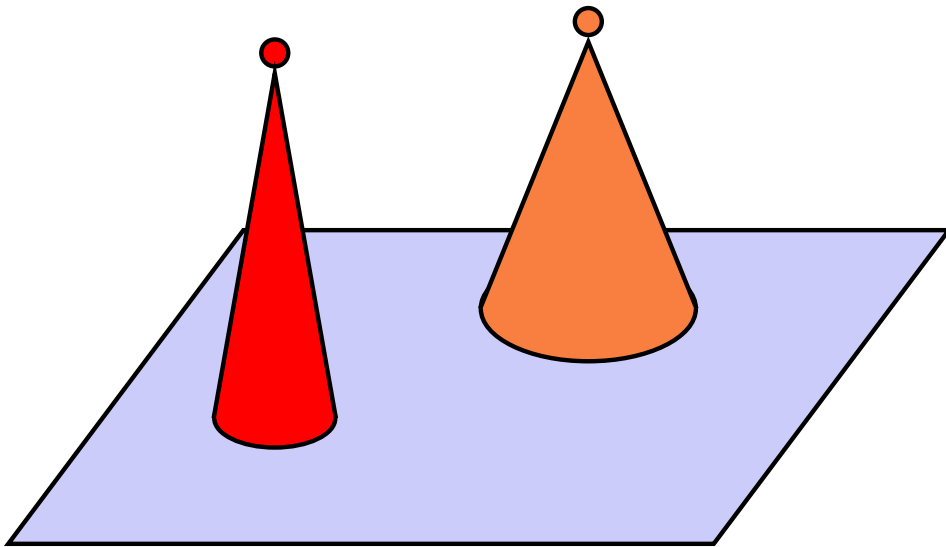
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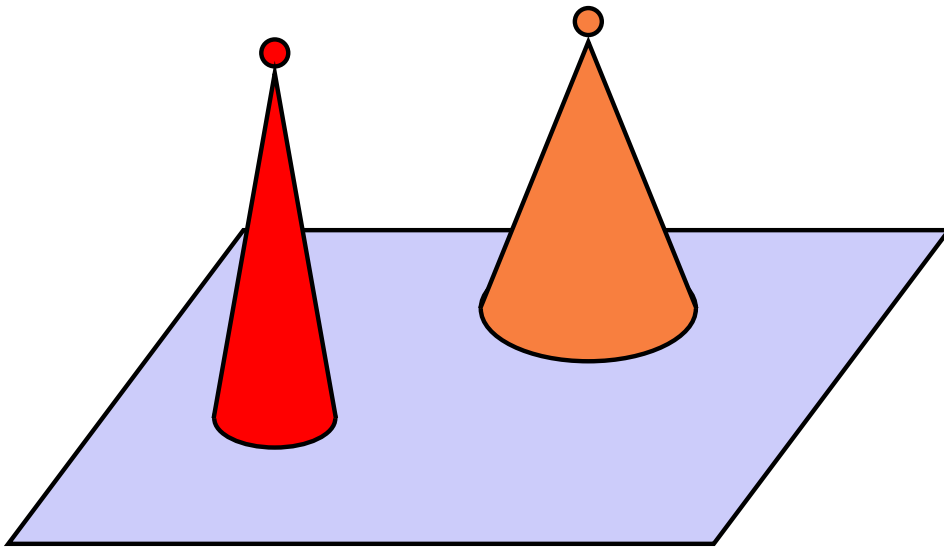
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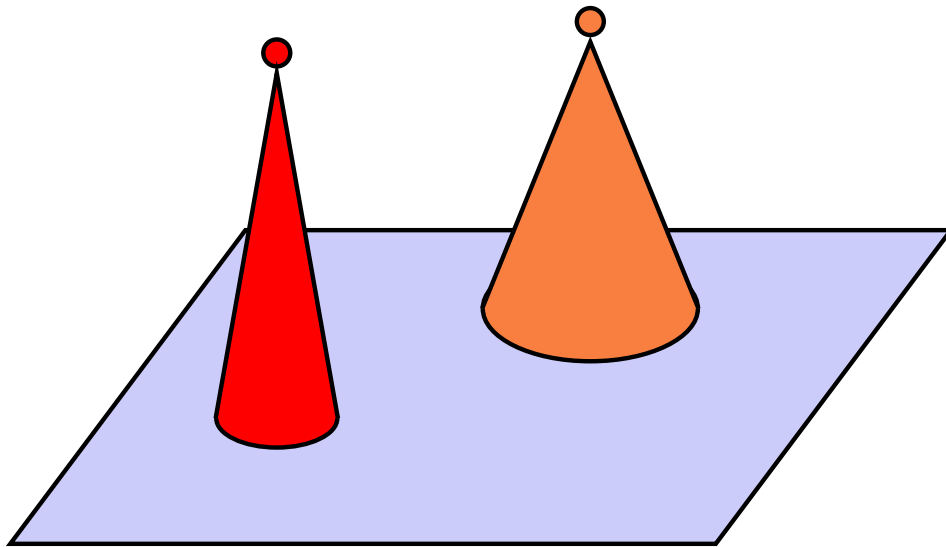
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Cooperative work

# Mexican hats

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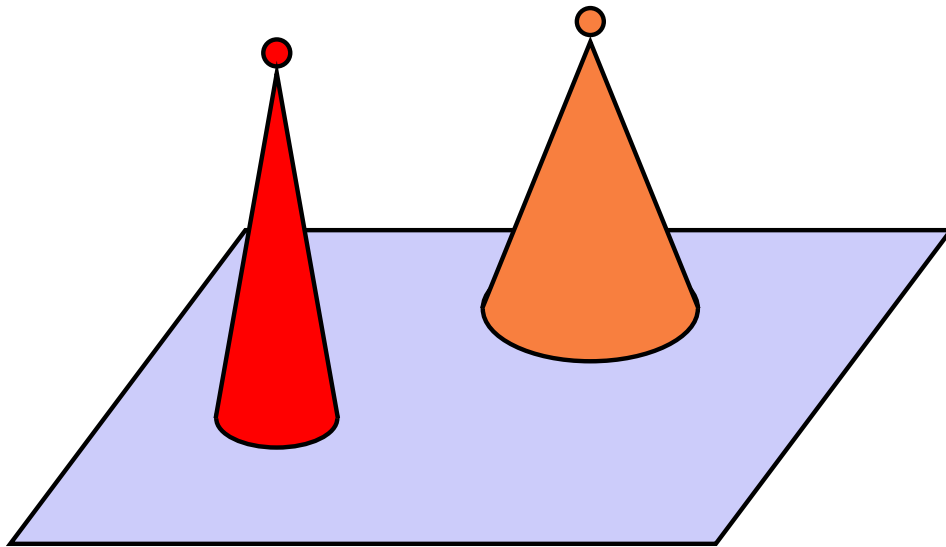


Cooperative work

Wikipedia effect

# Mexican hats

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Cooperative work

Wikipedia effect

Education

# Technical Proofs

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Not every proof is nice and tiny

# Technical Proofs

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Not every proof is nice and tiny

## Example

J. Demmel and Y. Hida,

*Accurate floating point summation*

19 page proof

# Technical Proofs

**Property B:** The leftmost leading bit of  $\widehat{SUM}_{I+1}$  through  $\widehat{SUM}_n$  is to the left of the leading bit of  $SUM_I$ :  $\max_{k>I} E_k > E_I$ .

Now we may consider six cases, labeled 1A, 1B, 2A, 2B, 3A and 3B, according to which pair of properties holds. We may also have subcases of these cases depending on the size of  $n$ . There may be further subcases depending on when the exponents  $e_k$  and  $E_j$  further decrease below their initial levels.

We would like to believe a simpler proof exists, but have not managed to find one.

## 8.1 Case 1A - $n \leq \bar{n} + 1$

Property 1 means  $e_{I+1} \leq E_I - F + f - 1$ , so let  $K$  be the smallest integer in the range  $I \leq K \leq n$  such that  $e_k \leq E_I - F + f - 2$  for all  $k > K$ . In other words,  $e_{I+1}$  through  $e_K$  are all  $E_I - F + f - 1$ , and  $e_{K+1}$  through  $e_n$  are all at most  $E_I - F + f - 2$ . Note that either list, but not both, can be vacuous. Thus we have the bounds

$$|s_k| \leq \begin{cases} 2^{E_I - F + f} (1 - 2^{-f}) & \text{for } I + 1 \leq k \leq K \\ 2^{E_I - F + f - 1} (1 - 2^{-f}) & \text{for } K + 1 \leq k \leq n \end{cases} \quad (9)$$

Property A implies  $E_k \leq E_I$  for all  $k \geq I$ , so let  $J$  be the largest integer in the range  $I \leq J \leq n$  such that  $E_J = E_I$  but  $E_j < E_I$  for all  $j > J$ . In other words  $\widehat{SUM}_J$  is the last computed partial sum with the exponent  $E_I$ . This enables us to bound 1 ulp on the partial sums:

$$\text{ulp}(\widehat{SUM}_j) \leq \begin{cases} 2^{E_I - F + 1} & \text{for } I \leq j \leq J \\ 2^{E_I - F} & \text{for } J + 1 \leq j \leq n \end{cases} \quad (10)$$

We consider the cases  $J \leq K$  and  $K < J$  separately.

### 8.1.1 Case $J \leq K$

In this case, we have  $1 \leq I \leq J \leq K \leq n$ . The additions of  $s_{I+1}$  through  $s_J$ , resulting in  $\widehat{SUM}_{I+1}$  through  $\widehat{SUM}_J$ , can yield a maximum roundoff error of half an ulp in each of  $\widehat{SUM}_{I+1}$  through  $\widehat{SUM}_J$ , which is at most  $2^{E_I - F}$  each. If  $K \geq J + 1$ , then addition of  $s_{J+1}$  causes *no roundoff*, since  $\widehat{SUM}_{J+1}$  is computed by exact cancellation. Additions of  $s_{J+2}$  through  $s_K$  to the partial sums  $\widehat{SUM}_{J+1}$  through  $\widehat{SUM}_{K-1}$ , resulting in the partial sums  $\widehat{SUM}_{J+2}$  through  $\widehat{SUM}_K$ , also causes *no roundoff*, since all the numbers involved occupies the same  $F$ -bit range. Finally, the additions of  $s_{K+1}$  through  $s_n$  can cause roundoff errors at most  $2^{E_I - F - 1}$  each. Thus we have the roundoff error bounds

$$|\epsilon_i| \leq \begin{cases} 2^{E_I - F} & \text{for } I + 1 \leq i \leq J \\ 0 & \text{for } J + 1 \leq i \leq K \\ 2^{E_I - F - 1} & \text{for } K + 1 \leq i \leq n \end{cases} \quad (11)$$

Thus we can bound the total roundoff error

$$\begin{aligned} |\widehat{SUM}_n - S| &\leq \sum_{i=I+1}^n |\epsilon_i| \\ &\leq (J - I) 2^{E_I - F} + (n - K) 2^{E_I - F - 1} \\ &= (2J - 2I + n - K) 2^{E_I - F - 1} \\ &= 2^{E_I} N_{1A, J \leq K}(I, J, K, n), \end{aligned} \quad (12)$$

# Technical Proofs

where

$$N_{1A, J \leq K}(I, J, K, n) = (2J - 2I + n - K)2^{-F-1}.$$

We now bound  $|\widehat{SUM}_n|$  from below by noting that  $|\widehat{SUM}_J| \geq 2^{E_I}$  and using the triangle inequality:

$$\begin{aligned} |\widehat{SUM}_n| &= |\widehat{SUM}_J + (s_{J+1} + \dots + s_n) + (\epsilon_{J+1} + \dots + \epsilon_n)| \\ &\geq |\widehat{SUM}_J| - \sum_{i=J+1}^n |s_i| - \sum_{i=J+1}^n |\epsilon_i| \\ &\geq 2^{E_I} - (K - J)2^{E_I + f - F}(1 - 2^{-f}) - (n - K)2^{E_I + f - F - 1}(1 - 2^{-f}) - (n - K)2^{E_I - F - 1} \\ &= 2^{E_I} \left[ 1 - (K - 2J + n)2^{f - F - 1}(1 - 2^{-f}) - (n - K)2^{-F - 1} \right] \\ &= 2^{E_I} D_{1A, J \leq K}(J, K, n), \end{aligned} \quad (13)$$

where

$$D_{1A, J \leq K}(J, K, n) = 1 - (K - 2J + n)2^{f - F - 1}(1 - 2^{-f}) - (n - K)2^{-F - 1}.$$

The relative error is then bounded by

$$\frac{|\widehat{SUM}_n - S|}{|\widehat{SUM}_n|} \leq \frac{N_{1A, J \leq K}(I, J, K, n)}{D_{1A, J \leq K}(J, K, n)} \equiv RE_{1A, J \leq K}(I, J, K, n). \quad (14)$$

Note that  $I = J < K$  cannot occur since means that  $E_{I+1} < E_I - 1$  and  $\widehat{SUM}_{I+1}$  is computed without roundoff by exact cancellation, contradicting our choice of  $I$ . Hence we must have either  $I = J = K$  or  $I < J \leq K$ , and the worst case relative error is bounded by the maximum of  $RE_{1A, J \leq K}(I, J, K, n)$  over the domain  $U = \{(I, J, K) \mid 1 \leq I = J = K \leq n \text{ or } 1 \leq I < J \leq K \leq n\}$ :

$$\frac{|\widehat{SUM}_n - S|}{|\widehat{SUM}_n|} \leq \max_{(I, J, K) \in U} RE_{1A, J \leq K}(I, J, K, n).$$

We consider the two cases  $I = J = K$  and  $I < J \leq K$  separately.

**8.1.1.1 Case  $I = J = K$ .** We first note that the denominator  $D_{1A, J \leq K}(I, I, n)$  becomes

$$D_{1A, J \leq K}(I, I, n) = 1 - (n - I)2^{f - F - 1}.$$

Since  $(n - I) \leq \bar{n}$ , we can use bound (7) to get

$$D_{1A, J \leq K}(I, I, n) \geq 1 - \bar{n}2^{f - F - 1} > 1 - \frac{2^{-1} + 2^{f - F - 1}}{1 - 2^{-f}} \geq 1 - \frac{2^{-1} + 2^{-2}}{1 - 2^{-2}} = 0.$$

Thus  $n \leq \bar{n} + 1$  implies that the denominator is positive.

If  $(n - I) \leq \bar{n} - 1$  (implied by  $n \leq \bar{n}$ ), then

$$\begin{aligned} RE_{1A, J \leq K}(I, I, I, n) &\leq \frac{(\bar{n} - 1)2^{-F-1}}{1 - (\bar{n} - 1)2^{f - F - 1}} \\ &= \frac{2^{-1-f} - 2^{-F-1-r}}{(1 - 2^{-f}) - (2^{-1} - 2^{f - F - r - 1})} \end{aligned}$$



# Technical Proofs

$$\begin{aligned}
 &= \frac{2^{-f}(1-2^{f-F-r})}{1-2^{1-f}+2^{f-F-r}} \\
 &< \frac{2^{-f}}{1-2^{1-f}}.
 \end{aligned} \tag{15}$$

If  $(n-I) = \bar{n}$  (implying  $n = \bar{n} + 1$ ), then

$$\begin{aligned}
 RE_{1A, J \leq K}(I, I, I, n) &\leq \frac{\bar{n}2^{-F-1}}{1-\bar{n}2^{f-F-1}} \\
 &= \frac{2^{-1-f} + (1-2^{-f}-2^{-r})2^{-F-1}}{(1-2^{-f})-2^{-1}-(1-2^{-f}-2^{-r})2^{f-F-1}} \\
 &= \frac{2^{-f} [2^{-1} + (1-2^{-f}-2^{-r})2^{f-F-1}]}{(1-2^{-f})-2^{-1}-(1-2^{-f}-2^{-r})2^{f-F-1}} \\
 &= \frac{2^{-f} [1 + (1-2^{-f}-2^{-r})2^{f-F}]}{1-2^{1-f}-(1-2^{-f}-2^{-r})2^{f-F}}.
 \end{aligned} \tag{16}$$

To bound the last line in the above inequality, we consider the cases  $F-f=1$  and  $F-f \geq 2$  separately. If  $F-f=1$ , then  $r=f-1$ , and so

$$\begin{aligned}
 RE_{1A, J \leq K}(I, J, K, n) &\leq 2^{-f} \left[ \frac{1 + (1-2^{-f}-2^{-r})2^{f-F}}{1-2^{1-f}-(1-2^{-f}-2^{-r})2^{f-F}} \right] \\
 &= 2^{-f} \left[ \frac{1 + (1-2^{-f}-2^{1-f})2^{-1}}{1-2^{1-f}-(1-2^{-f}-2^{1-f})2^{-1}} \right] \\
 &= 2^{-f} \left[ \frac{3(1-2^{-f})}{1-2^{-f}} \right] \\
 &= 3 \cdot 2^{-f}.
 \end{aligned} \tag{17}$$

If  $F-f \geq 2$ , then

$$\begin{aligned}
 RE_{1A, J \leq K}(I, J, K, n) &\leq 2^{-f} \left[ \frac{1 + (1-2^{-f}-2^{-r})2^{f-F}}{1-2^{1-f}-(1-2^{-f}-2^{-r})2^{f-F}} \right] \\
 &\leq 2^{-f} \left[ \frac{1 + (1-2^{1-f})2^{-2}}{1-2^{1-f}-(1-2^{1-f})2^{-2}} \right] \\
 &= 2^{-f} \frac{1}{3} \left[ 1 + \frac{4}{1-2^{1-f}} \right] \\
 &\leq 3 \cdot 2^{-f}.
 \end{aligned} \tag{18}$$

Hence in either case,  $RE_{1A, J \leq K}(I, J, K, n) \leq 3 \cdot 2^{-f}$ .

**8.1.1.2 Case  $I < J \leq K$ .** We maximize  $RE_{1A, J \leq K}$  as follows. First, we need to confirm that the denominator  $D_{1A, J \leq K}(I, J, K, n)$  remains positive over the range of parameters, so that  $RE_{1A, J \leq K}(I, J, K, n)$  is bounded. Then we compute the derivatives of  $RE_{1A, J \leq K}(I, J, K, n)$  with respect to  $J$  and  $K$  in order to find the maximum.

# Proof and Computation

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## Computational Mathematics

# Proof and Computation

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Computational Mathematics:

Write the program

# Proof and Computation

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Computational Mathematics:

Write the program

Prove it correct

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Computational Mathematics:

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# Proof and Computation

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Computational Mathematics:

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Run it

Some verified implementations:

Gröbner, CAD, ...

# A Toy Example

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How to define primality?

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$$a \mid b \equiv_{def} \exists c, b = a * c$$



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$$a \mid b \equiv_{def} \exists c, b = a * c$$

$$\begin{aligned} \text{prime}(p) \equiv_{def} & \quad \forall c, c \mid p \Rightarrow (c = 1 \vee c = p) \\ & \quad \wedge \quad p \neq 1 \end{aligned}$$

# Millenium Prime

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16956227128806874788740039322257331454187103117215  
25840282275463944443915017665187677648590458000952  
76019439238167628964472781614506010476756059209553  
52991146912809889393788383275988559054911295888721  
82960597685441916678707363819484213131086251607398  
28916259849380903171097200622744525334228076766180  
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36954810760431933960890325207991357855479116978257  
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90885182138135695302659166091775570804154531803228  
62568934813720132935654045610123135360707455696482  
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96020479134995279005506892191527037067638499420678  
41781864906059067455902834520379834660782200872459  
36042046285093059704977817748127777709652208140691

is prime

# Pocklington's Criterion

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Test to assess the primality of a number  $n$

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$$a^{n-1} \equiv 1[n]$$

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$$n - 1 = p_1^{k_1} \dots p_i^{k_i} r \text{ and } \sqrt{n} \leq p_1^{k_1} \dots p_i^{k_i}$$

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$$\gcd(a^{n-1/p_j} - 1, n) = 1 \text{ for all } j = 1 \dots i$$

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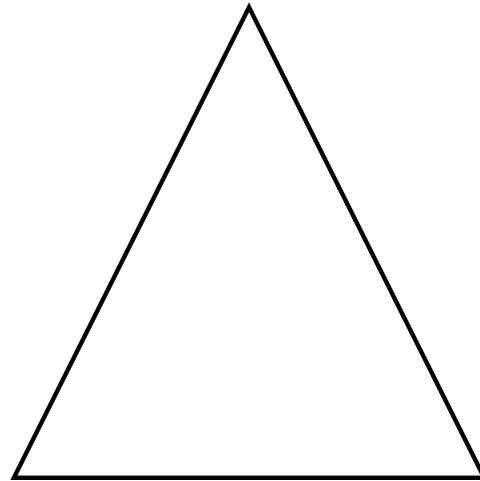
$$\gcd(a^{n-1/p_j} - 1, n) = 1 \text{ for all } j = 1 \dots i$$

Then  $n$  is prime.

For the millenium prime,  $a = 2$ ,  $p_1 = 2161$ ,  $p_2 = 2$ .

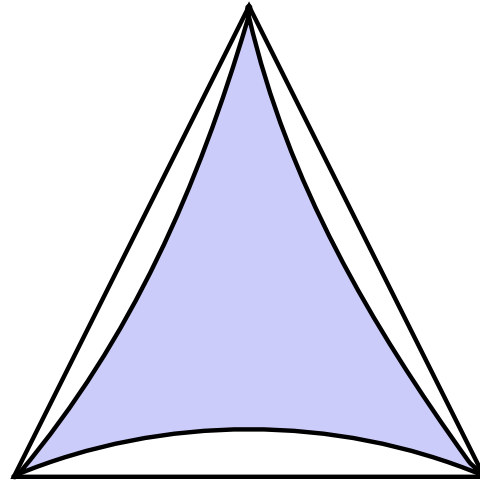
# Mechanized Proof

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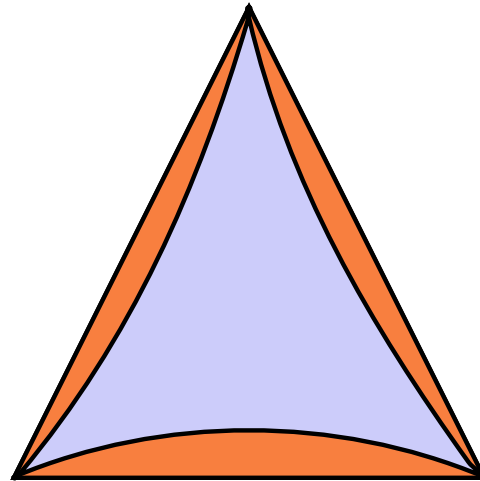
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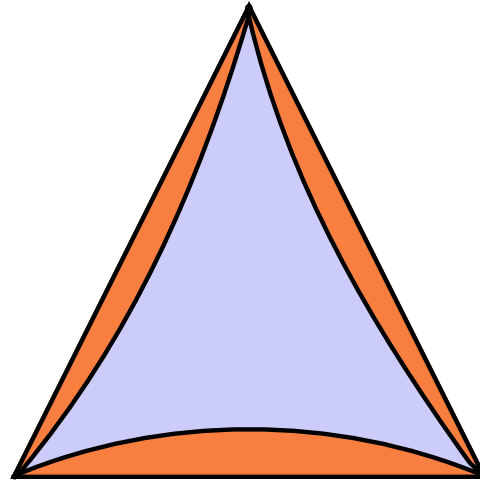
# Mechanized Proof

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# Mechanized Proof

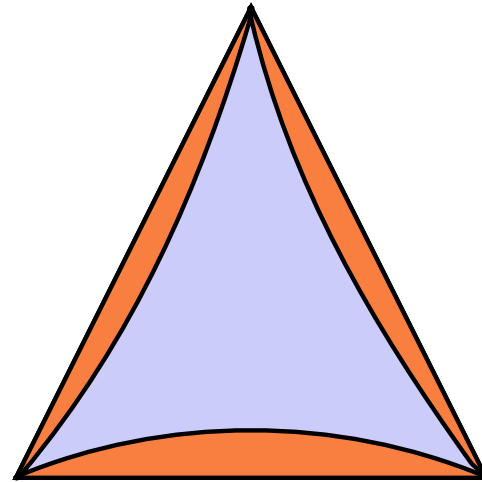
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Four Colour Theorem

# Mechanized Proof

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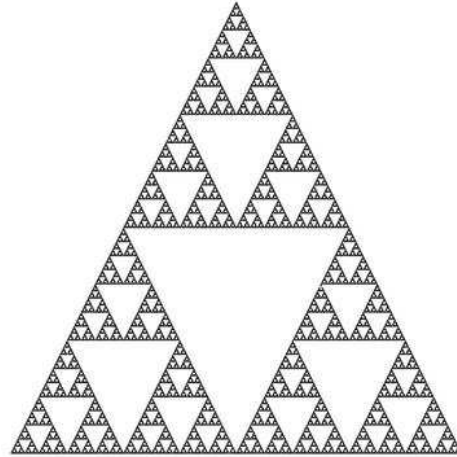


Four Colour Theorem

Flyspeck Project

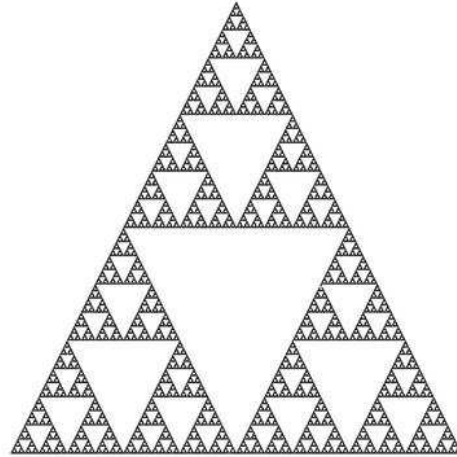
# Mechanized Proof

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# Mechanized Proof

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Enormous Theorem



# Challenges

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# Challenges

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Pen and Paper + Formal Proof



# Challenges

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Pen and Paper + Formal Proof



Proof + Computation

# Challenges

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Pen and Paper + Formal Proof



Proof + Computation

Collective effort

# Challenges

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Pen and Paper + Formal Proof



Proof + Computation

Collective effort