



Exact real arithmetic

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Typeset in $\text{\LaTeX}2\text{e}$ on a linux system

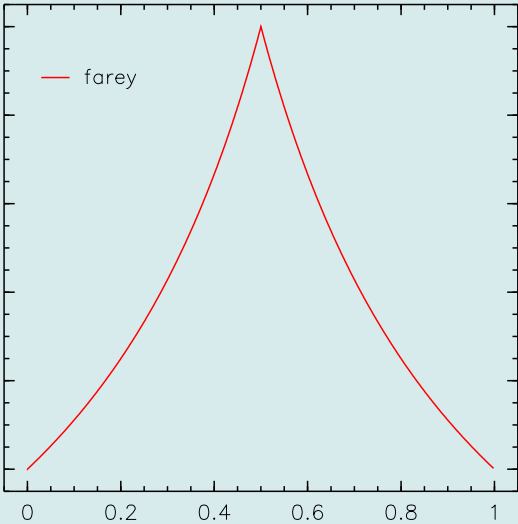
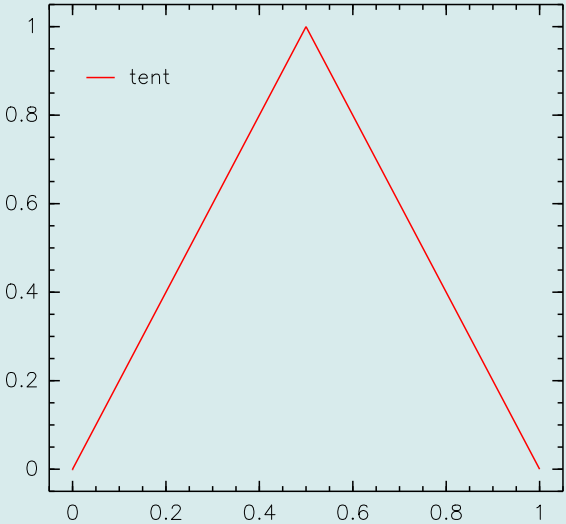
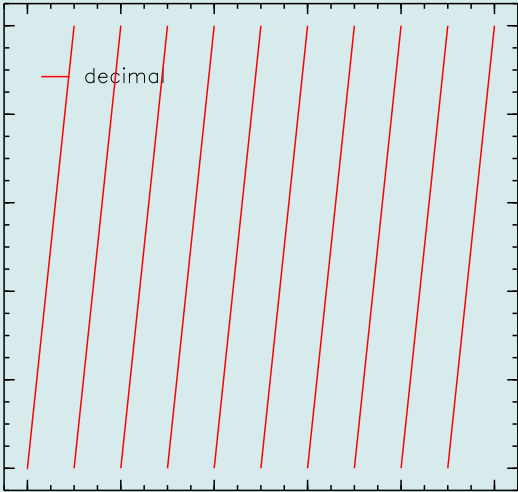
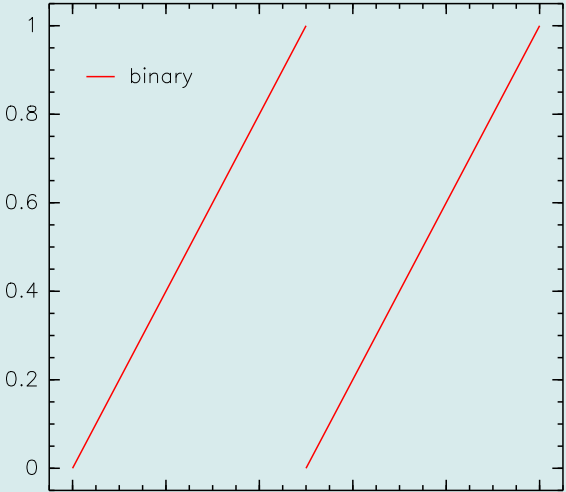


Outline

- What's the problem?
- Representation of reals
- Processing of reals
- Applications

- Integers: $\mathbb{Z} = \{ \dots, -2, -1, 0, 1, 2, \dots \}$
- Rationals: $\mathbb{Q} = \{ p/q; p, q \in \mathbb{Z} \}$
- Irrationals: all the rest: $\sqrt{2}, e, \pi, \dots$
- $\mathbb{R} = \mathbb{Q} \cup \text{irrationals}$
- $\mathbb{R} \setminus \mathbb{Q} = \{ \text{algebraics} \cup \text{transcendentals} \}$

Digit expansions



$$\mathbb{F} = \{ m 2^e : |m| < 2^{53}, |e| < 1024, \text{NaN}, \text{Inf} \}$$

$$\mathbb{O} = \{ +, -, *, / \}$$

Problems!

$$x_0 = 0.9$$

$$x_{k+1} = 3.999 x_k (1 - x_k) \quad k = 0, 1, 2, \dots$$

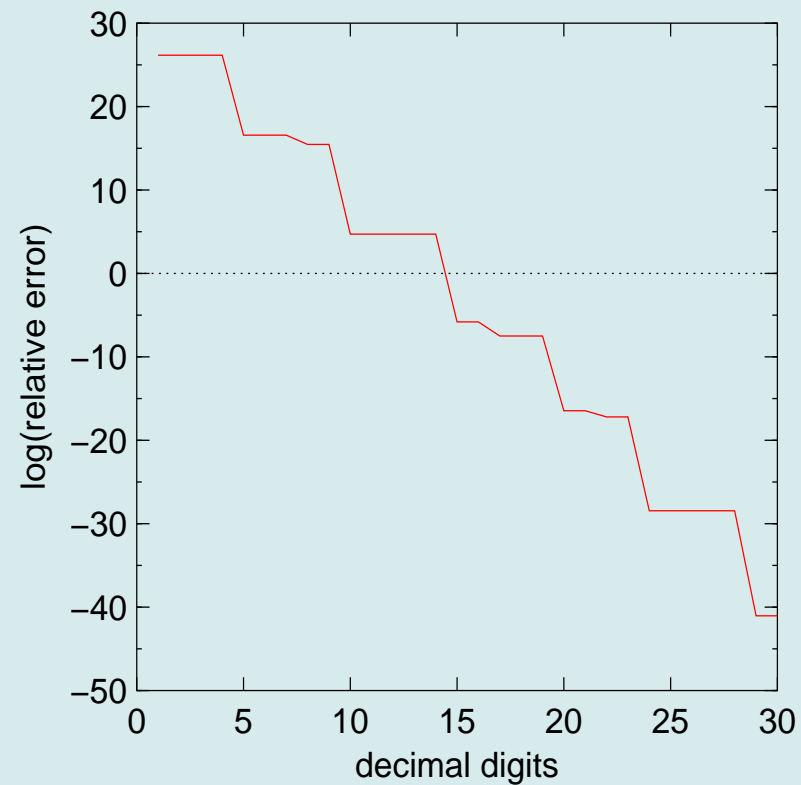
In \mathbb{F} , $x_{53} > 0.5$, but the exact result is

$$x_{53} = 0.130235874811773733039643730080570 \dots$$

Another floating point disaster

$$u_0 = e - 1$$

$$u_k = k u_{k-1} - 1 \quad k = 1, \dots, 25$$



Continued fraction arithmetic

$$x = [x_0; x_1, x_2, x_3, \dots] = x_0 + \frac{1}{x_1 + \frac{1}{x_2 + \dots}}$$

Studied by Gosper, Vuillemin, Liardet, Stambul, Ménéssier-Morain, Potts.

Only easy operation: $\frac{ax+b}{cx+d}$.

For $+$, $*$ etc., inefficient.

For \exp , \sin etc., very inefficient!

How do we convert inputs to required cf form?

necessarily involves a *limit* of a sequence of rationals:

- digit expansions (possibly with negative digits)
- symbolic dynamics of an expanding map
- continued fractions
- nested intervals with rational endpoints
- Dedekind cuts
- Conway's construction
- ...



Traditional digit expansions converge strictly from below, so ...

- Digit expansions with negative digits
- Continued fractions
- Möbius maps (LFTs)
- Non-integer base - e.g. golden ratio
- Does something even better exist? ...

We want a representation that allows the computation of more significant digits first

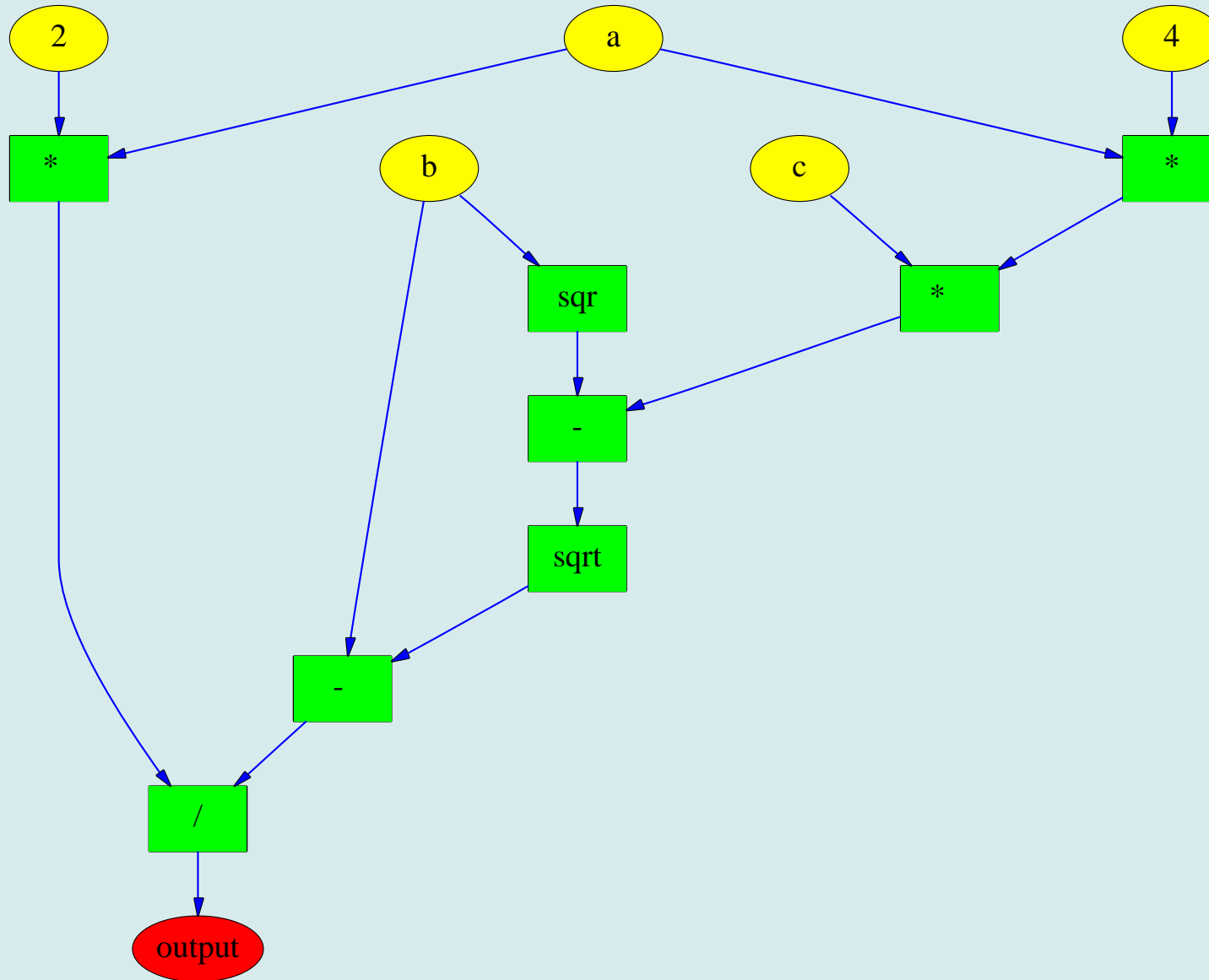


Can we compute with *limits*?

Conventionally, no; but what if all our limits converge at the same rate?

- Example: solve a quadratic
- $ax^2 + bx + c = 0$
- $x = \frac{-b + \sqrt{b^2 - 4ac}}{2a}$

Data flow 2



What's wrong with that?

- Input nodes don't know how much precision to send
- All input nodes send data, even if it eventually may not be needed
- To recalculate requires the whole tree to be re-evaluated



For $\hat{x} \in \mathbb{R}$, consider a function χ such that

$$| B^n \hat{x} - \chi(n) | < 1$$

for fixed $B = 2, 3, 4, \dots$

$$n \in \mathbb{Z}^+$$

$$\chi : \mathbb{Z}^+ \rightarrow \mathbb{Z} \quad (\chi \in \mathbb{X}\mathbb{R})$$



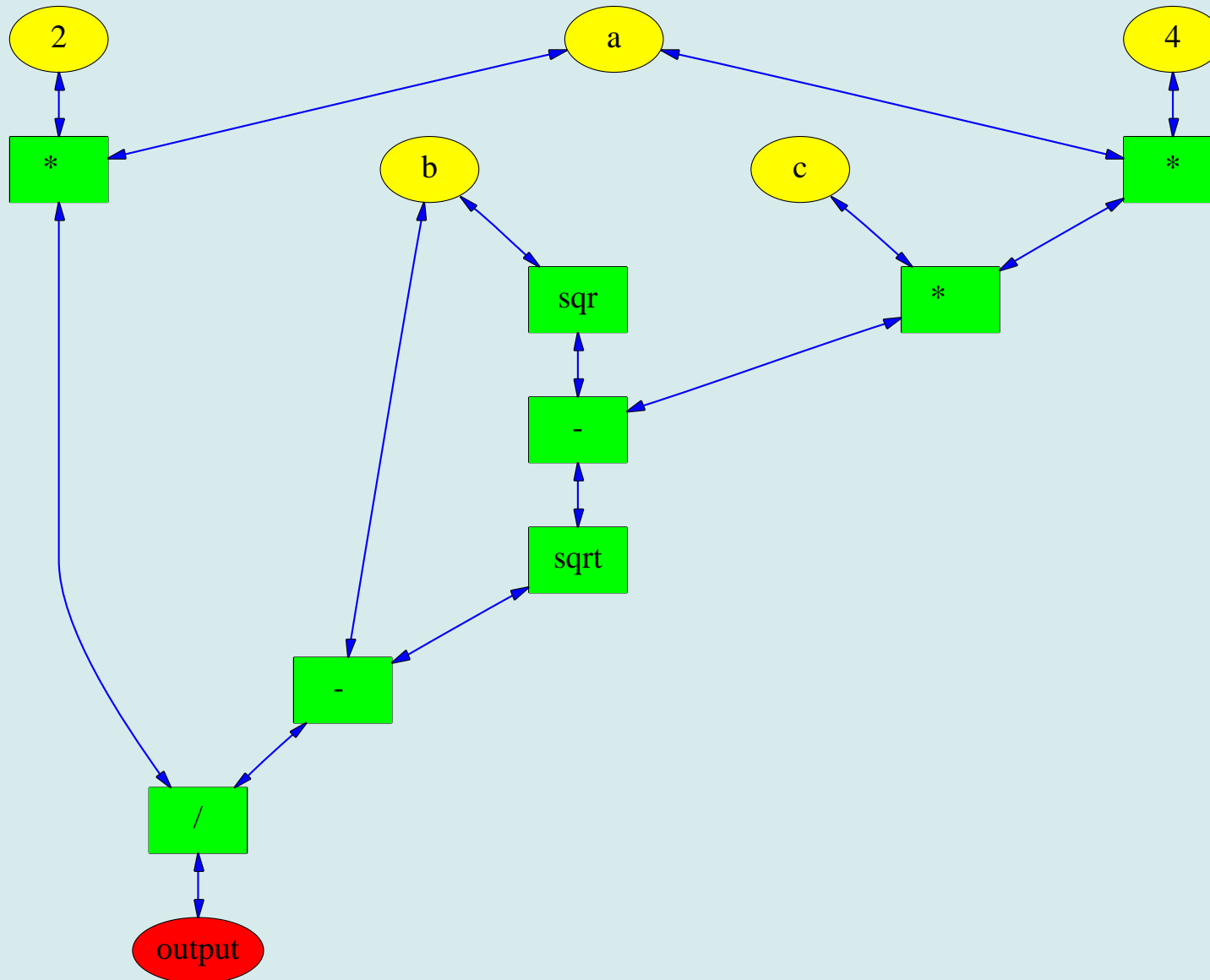
In other words,

$$\frac{x(n) - 1}{B^n} < \hat{x} < \frac{x(n) + 1}{B^n}$$

Example: $\hat{x} \in \mathbb{Q}$, $x(n) \equiv \lfloor B^n \hat{x} \rfloor$

NB: we reduce all computation with $\mathbb{X}R$ s to integer calculations.

Data flow 3



$$[x + y](n) \equiv \lfloor (x(n+2) + y(n+2) + 2) / 4 \rfloor$$

$$\begin{aligned}
 & | [x + y](n) - 2^n(\hat{x} + \hat{y}) | \\
 = & | \lfloor (x(n+2) + y(n+2) + 2) / 4 \rfloor - 2^n(\hat{x} + \hat{y}) | \\
 \leq & 1/2 + | (x(n+2) + y(n+2)) / 4 - 2^n(\hat{x} + \hat{y}) | \\
 = & 1/2 + | x(n+2) + y(n+2) - 2^{n+2}(\hat{x} + \hat{y}) | / 4 \\
 \leq & 1/2 + | x(n+2) - 2^{n+2}\hat{x} | / 4 \\
 & + | y(n+2) - 2^{n+2}\hat{y} | / 4 \\
 = & 1
 \end{aligned}$$



Produce efficient software which hides the bottom-up data flow and can be used by a programmer as if it were conventional top-down code

Not possible in Fortran, C, Java, ...

Possible in python, Haskell, clean, ML, ocaml, (and C++)

The answer: lazy evaluation

Algebraic number construction

Given a polynomial p with integer coefficients, and integers $a, k > 0$, we can compute the sign of p at a/B^k with only integer operations.

```
def sign_at(p, a, k):  
    n, w = len(p), p[0]  
    for j in 1..n:  
        w* = a  
        w += p[j] * B^(k*j)  
    return w > 0
```

Thus, given a bracketed root:

$$\text{sign } p(a/B^k) < 0, \quad \text{sign } p(b/B^k) > 0$$

we may refine it by bisection to any desired accuracy.

$f = \exp, \arctan, \sin$ etc. can be computed if we can implement an approximating function

$\tilde{f} : \mathbb{Q} \times \mathbb{Z}^+ \rightarrow \mathbb{Z}$ such that

$$| B^n f(q) - \tilde{f}(q, n) | < 1$$

This can be achieved using Taylor polynomials with bounds on the error term.

For π , use

$$\pi = \sum_{n=0}^{\infty} \left[\frac{4}{8n+1} - \frac{2}{8n+4} - \frac{1}{8n+5} - \frac{1}{8n+6} \right] \frac{1}{16^n}$$



`www.python.org`

- ‘improved perl’
- much cleaner syntax than java ...
- ... but just as powerful
- portable
- functional features - lambda
- operator overloading
- free!

```
def +(x, y):  
    return lambda n: (x(n+2)+y(n+2)+2) / 4  
  
def sqrt(x):  
    return lambda n: sqrt(x(2*n))
```



Principle:

Do not evaluate arguments until necessary

```
def if_nonzero(f, x):  
    " return a function which computes  
    f if x is nonzero, else None "  
    if x: return lambda x: f(x)  
    return None
```

Equality is undecidable, but ...

This is a system for proving inequalities

```
def <(x, y):  
    n=1  
    while 1:  
        if x(n)<y(n)-1: return true  
        if x(n)>y(n)+1: return false  
        n++
```


Python implementation in action

```
kbriggsetantalum:~/XR-2.0> python
Python 2.2 (#1, Dec 31 2001, 13:51:20)
[GCC 2.95.2 19991024 (release)] on linux2
Type "help", "copyright", "credits" or "license" for more information.
>>> from XR import *
>>> x=exp(pi()*sqrt(XR(163)))
>>> print floor(x)<x
1
>>> e=exp(XR(1))
>>> print contfrac(e)
[2L, 1L, 2L, 1L, 1L, 4L, 1L, 1L, 6L, 1L, 1L, 8L, 1L, 1L, 10L, 1L, 1L, 12L, 1L, 1
L, 14L]
>>> print cos(2*pi()/7).dec(50)
0.62348980185873353052500488400423981063227473089640e0
>>> print polyroot([8,4,-4,-1],0,1,0).dec(50)
0.62348980185873353052500488400423981063227473089640e0
>>> x=XR(Q(1,3))
>>> for i in range(20):
...     print 2*x>1,
...     x=4*x*(1-x)
...
0 1 0 1 0 1 1 0 0 1 1 0 1 0 0 1 1 1 1 0
>>> █
```

Python implementation in action

```
> import XR
> x=exp(pi()*sqrt(XR(163)))
> print floor(x)<x
1
> e=exp(XR(1))
> print contfrac(e)
[2, 1, 2, 1, 1, 4, 1, 1, 6, 1, 1, 8, 1, 1, 10, 1,
1, 12, 1, 1, 14]
> print cos(2*pi()/7).dec(50)
0.62348980185873353052500488400423981063227473
> print polyroot([8,4,-4,-1],0,1,0).dec(50)
0.62348980185873353052500488400423981063227473
> x=XR(Q(1,3))
> for i in range(10):
...     print 2*x>1
...     x=4*x*(1-x)
...
0 1 0 1 0 1 1 0 0 1
```

```
#include "XR.h"
```

```
int main() {  
    XR x=exp(pi()*sqrt(XR(163)));  
    cout<<floor(x)<x;  
    XR e=exp(XR(1));  
    cout<<contfrac(e);  
    cout<<cos(2*pi()/7).dec(50);  
    ZZ coeffs[]={8,4,-4,-1};  
    cout<<polyroot(coeffs,0,1,0).dec(50);  
    x=XR(Q(1,3));  
    for (int i=0; i<10; i++) {  
        cout<<2*x>1;  
        x=4*x*(1-x);  
    }  
    return 0;  
}
```



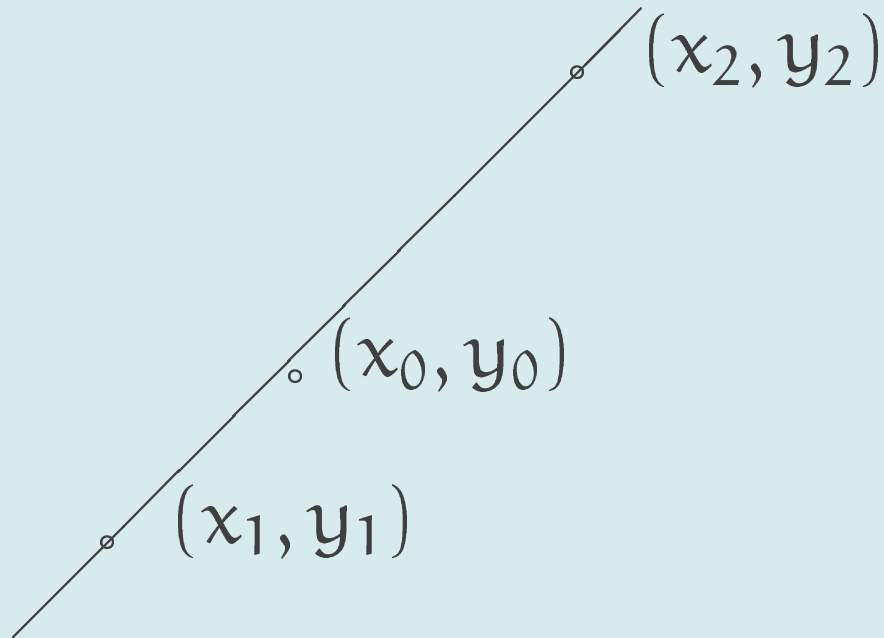
Features of my implementations

- python, C++
- All integer arithmetic
- Caching
- Easily integrated with existing code
- C++ version is fully compiled
- Applications in computational number theory, computer-assisted proofs, computer algebra, ...



Simple planar example:

Line through (x_1, y_1) , (x_2, y_2) ; is the point (x_0, y_0) to the left or right of the line?





This is determined by

$$\text{sign}([(y_1 - y_0)(x_2 - x_1) - (x_1 - x_0)(y_2 - y_1)])$$

With XR arithmetic, the sign is always determined correctly and with the minimal necessary computation

1. Simultaneous Diophantine approximation algorithms

Typical subproblem: given

$$x_1, x_2 \in \mathbb{X}\mathbb{R}$$

$$p_1, p_2, q \in \mathbb{Z}$$

$$e_1 = |qx_1 - p_1|, e_2 = |qx_2 - p_2|$$


Is $e_1 > e_2$ or not?

2. Is $\exp(\pi\sqrt{163})$ an integer?

```
x=exp(pi*sqrt(XR(163)))
```

```
f=floor(x)
```

```
print x>f, x<f+1 # => true, true
```

- 
1. Memory demands
 2. Non-incrementality
 3. The floor function does not terminate on integer inputs
 4. This makes implementing `exp` etc. hard
 5. (Verified) decimal output




Maths \iff *software*

Mathematics \implies mathematical software

{ Numerical analysis
Statistics
Computer algebra
Computational number theory
Combinatorics and graph theory
Finite groups
Theorem proving
...

What about the other direction?



It's worth rethinking how we represent numbers and do arithmetic, especially for distributed applications



V Ménissier-Morain: *Arithmétique exacte, conception, algorithmique et performances d'une implémentation informatique en précision arbitraire*

Paris thesis 1994

`calfor.lip6.fr/~vmm/`

J R Harrison: *Theorem proving with the real numbers*

Cambridge thesis 1996

`www.ftp.cl.cam.ac.uk/ftp/papers/reports/`

K M Briggs: *XR homepage*

`more.btexact.com/people/briggsk2/XR.html`