

# Nonlinear Arithmetic in PVS

Anthony Narkawicz

NASA Langley Research Center  
`anthony.narkawicz@nasa.gov`

PVS Class 2012

# Nonlinear Arithmetic

**Interval** can solve problems like

```
ex_ba : LEMMA
  x ## [-1/2,0] IMPLIES
  abs(ln(1+x) - x) - epsilon <= 2*sq(x)
```

**Bernstein** can solve problems like:

```
p1 : LEMMA
  FORALL (x,y:real): -0.5 <= x AND x <= 1 AND
                    -2 <= y AND y <= 1 IMPLIES
    4*x^2-(21/10)*x^4+(1/3)*x^6+(x-3)*y-4*y^2+4*y^4 > -3.4
```

```
p2 : LEMMA
  EXISTS (x,y:real): -0.5 <= x AND x <= 1 AND
                    -2 <= y AND y <= 1 AND
    4*x^2-(21/10)*x^4+(1/3)*x^6+(x-3)*y-4*y^2+4*y^4 < -3.39
```

These lemmas are proved by executing a single command!

# Interval

<http://shemesh.larc.nasa.gov/people/cam/Interval>

- ▶ **Interval** is a PVS package for interval analysis.
- ▶ The package consists of:
  - ▶ The library `interval_arith`, which presents a formalization of interval analysis for real-valued functions including: trigonometric functions, logarithm and exponential functions, square root, absolute value, etc.
  - ▶ The strategy **numerical**, which implements a provably correct branch-and-bound interval analysis algorithm.
- ▶ **Interval is part of the NASA PVS Libraries.**

# A Simple Problem

Prove that the turn rate of an aircraft with a bank angle of  $35^\circ$  is greater than  $3^\circ$  per second.



## A Simple Problem

Prove that the turn rate of an aircraft with a bank angle of  $35^\circ$  is greater than  $3^\circ$  per second.

```
IMPORTING interval_arith@strategies
```

```
g:posreal=9.8          %[m/s^2]
```

```
v:posreal=250*0.514    %[m/s]
```

```
tr(phi:(Tan?)): MACRO real = g*tan(phi)/v
```

```
tr_35 : LEMMA
```

```
  3*pi/180 <= tr(35*pi/180)
```

numerical

tr\_35 :

|-----  
{1} 3 \* pi / 180 <= g \* tan(35 \* pi / 180) / v

Rule? (numerical)

Evaluating formula using numerical approximations,  
Q.E.D.

Note that pi is the mathematical irrational number  $\pi$  and tan is the trigonometric function tan.

numerical

tr\_35 :

|-----

{1}     $3 * \pi / 180 \leq g * \tan(35 * \pi / 180) / v$

Rule? (numerical)

Evaluating formula using numerical approximations,  
Q.E.D.

Note that pi is the mathematical irrational number  $\pi$  and tan is the trigonometric function tan.

# A Simple Property of Logarithms

```
G(x:real|x < 1): MACRO real = 3*x/2 - ln(1-x)
```

```
A_and_S : LEMMA
```

```
  let x = 0.5828 in
```

```
    G(x) > 0
```



# A Simple Property of Logarithms

A\_and\_S :

|-----  
{1} LET x = 0.5828 IN 3 \* x / 2 - ln(1 - x) > 0

Rule? (numerical)

Evaluating formula using numerical approximations,  
Q.E.D.

Note that  $\ln$  is natural logarithm function.

# A Simple Property of Logarithms

A\_and\_S :

|-----  
{1} LET x = 0.5828 IN 3 \* x / 2 - ln(1 - x) > 0

Rule? (numerical)

Evaluating formula using numerical approximations,  
Q.E.D.

Note that ln is natural logarithm function.

# Interval Arithmetic

```
{-1}  x ## [| 0, 2 |]  
      |-----  
{1}   sqrt(x) + sqrt(3) < pi + 0.1
```

Rule? (numerical :vars "x")

Evaluating formula using numerical approximations,  
Q.E.D.

# Interval Arithmetic

```
{-1}  x ## [| 0, 2 |]  
      |-----  
{1}   sqrt(x) + sqrt(3) < pi + 0.1
```

Rule? (numerical :vars "x")

Evaluating formula using numerical approximations,  
Q.E.D.

# Interval Analysis

Prove that for all  $x \in [-\frac{1}{2}, 0]$ ,

$$|\ln(1+x) - x| - \epsilon \leq 2x^2,$$

where  $\epsilon = 0.15$ :<sup>1</sup>

```
ex_ba : LEMMA
  x ## [-1/2,0] IMPLIES
  abs(ln(1+x) - x) - epsilon <= 2*sq(x)
```

---

<sup>1</sup>Thanks to Behzad Akbarpour.

## instint

```
ex_ba :  
  |-----  
{1} FORALL (x: real):  
    x ## [| -1/2, 0 |] IMPLIES abs(ln(1+x)-x)-0.15 <= 2*sq(x)
```

Rule? (skeep)

```
ex_ba :  
{-1} x ## [| -1 / 2, 0 |]  
  |-----  
{1} abs(ln(1 + x) - x) - 0.15 <= 2 * sq(x)
```

Rule? (numerical :vars (("x" 10)))

Evaluating formula using numerical approximations,  
Q.E.D.

## instint

```
ex_ba :  
  |-----  
{1} FORALL (x: real):  
    x ## [| -1/2, 0 |] IMPLIES abs(ln(1+x)-x)-0.15 <= 2*sq(x)
```

Rule? (skeep)

```
ex_ba :  
{-1} x ## [| -1 / 2, 0 |]  
  |-----  
{1} abs(ln(1 + x) - x) - 0.15 <= 2 * sq(x)
```

Rule? (numerical :vars (("x" 10)))

Evaluating formula using numerical approximations,  
Q.E.D.

## instint

```
ex_ba :  
  |-----  
{1} FORALL (x: real):  
    x ## [| -1/2, 0 |] IMPLIES abs(ln(1+x)-x)-0.15 <= 2*sq(x)
```

Rule? (skip)

```
ex_ba :  
{-1} x ## [| -1 / 2, 0 |]  
  |-----  
{1} abs(ln(1 + x) - x) - 0.15 <= 2 * sq(x)
```

Rule? (numerical :vars (("x" 10)))

Evaluating formula using numerical approximations,  
Q.E.D.



# Bernstein

<http://shemesh.larc.nasa.gov/people/cam/Bernstein>

- ▶ **Bernstein** is a PVS package for solving multivariate polynomial global optimization problems using Bernstein polynomials.
- ▶ The package consists of:
  - ▶ The library **Bernstein**, which presents a formalization of an efficient representation of multivariate polynomials.
  - ▶ The strategy **bernstein**, which discharges simply quantified multivariate polynomial inequalities on closed/open ranges.
  - ▶ **Grizzly**, which is a prototype client-server tool for solving global optimization problems.
- ▶ **Bernstein is part of the NASA PVS Libraries.**

# Solving Polynomial Inequalities

```
IMPORTING Bernstein@strategy
```

```
p1 : LEMMA
```

```
  FORALL (x,y:real): -0.5 <= x AND x <= 1 AND  
                      -2 <= y AND y <= 1 IMPLIES  
      4*x^2-(21/10)*x^4+(1/3)*x^6+(x-3)*y-4*y^2+4*y^4 > -3.4
```

```
p2 : LEMMA
```

```
  EXISTS (x,y:real): -0.5 <= x AND x <= 1 AND  
                   -2 <= y AND y <= 1 AND  
      4*x^2-(21/10)*x^4+(1/3)*x^6+(x-3)*y-4*y^2+4*y^4 < -3.39
```

```
|-----
{1} FORALL (x, y: real):
    -0.5 <= x AND x <= 1 AND -2 <= y AND y <= 1 IMPLIES
        4*x^2-(21/10)*x^4+(1/3)*x^6+(x-3)*y-4*y^2+4*y^4 > -3.4
```

Rule? (bernstein)

Proving polynomial inequality using Bernstein'basis,  
Q.E.D.

```
|-----
{1} FORALL (x, y: real):
    -0.5 <= x AND x <= 1 AND -2 <= y AND y <= 1 IMPLIES
        4*x^2-(21/10)*x^4+(1/3)*x^6+(x-3)*y-4*y^2+4*y^4 > -3.4
```

Rule? (bernstein)

Proving polynomial inequality using Bernstein'basis,  
Q.E.D.

|-----

{1} EXISTS (x, y: real):

-0.5 <= x AND x <= 1 AND -2 <= y AND y <= 1 AND  
 $4x^2 - (21/10)x^4 + (1/3)x^6 + (x-3)y - 4y^2 + 4y^4 < -3.39$

Rule? (bernstein)

Proving polynomial inequality using Bernstein's basis,  
Q.E.D.

|-----

{1} EXISTS (x, y: real):

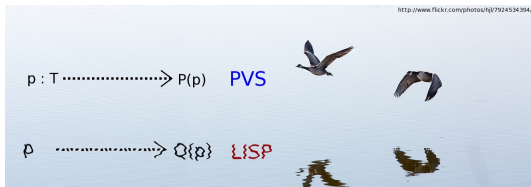
-0.5 <= x AND x <= 1 AND -2 <= y AND y <= 1 AND  
 $4x^2 - (21/10)x^4 + (1/3)x^6 + (x-3)y - 4y^2 + 4y^4 < -3.39$

Rule? (bernstein)

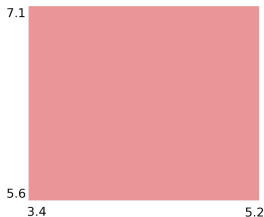
Proving polynomial inequality using Bernstein's basis,  
Q.E.D.

# Reflection

Both **Interval** and **Bernstein** use computation reflection

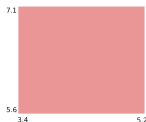


Both try to prove the result on a large box:

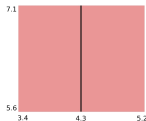


# Reflection

**Interval** and **Bernstein** each have a function that can (sometimes) tell whether the result holds on a particular box.



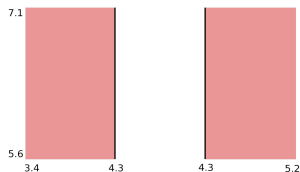
If that function returns *unknown*, then the box is split in two:



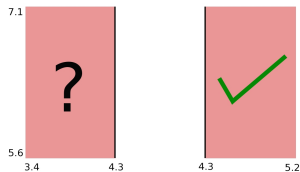


## Reflection

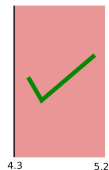
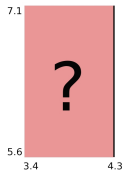
The two halves of the big box are now considered separately



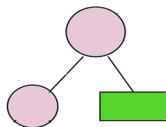
Perhaps we can prove it on the right but not the left sub-box:



# Reflection



This turns the proof tree into



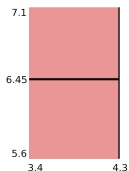
Proof Splits



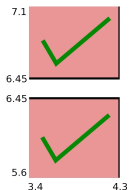
Proof Terminates

## Reflection

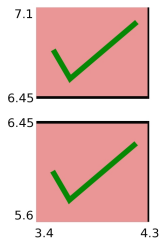
Now we split the left hand box into two smaller pieces:



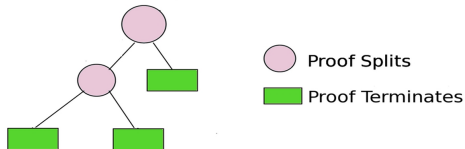
Perhaps the result can be proved on each of these boxes:



# Reflection



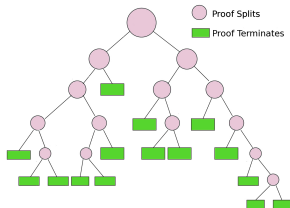
This turns the proof tree into



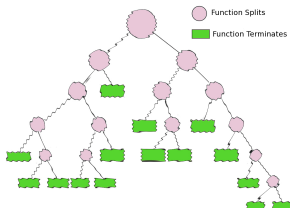


## Reflection

Instead of having PVS develop a proof of that looks like



There is a recursive reflection function in PVS whose execution looks like



# Reflection

- ▶ The proof tree happens entirely in LISP
- ▶ All of the proofs have the same length in PVS, for **Interval** and **Bernstein**
- ▶ Complicated problems could not be solved in PVS without using computational reflection in this way.





# Reflection

```
branch_and_bound(simplify, evaluate, branch, subdivide, denorm, combine, prune, le, ge, select, accumulate, maxdepth)
(obj, dom, acc, (dirvars || length(dirvars) <= maxdepth)) :

RECURSIVE Output =
LET
  nobj      = simplify(obj),
  thisans   = evaluate(dirvars, dom, nobj),
  newacc1   = IF none?(acc) THEN thisans ELSE accumulate(TRUE, some(acc), thisans) ENDIFF,
  thisout   = mk_out(thisans, ge(dirvars, newacc1, thisans), length(dirvars), 0)
IN
IF length(dirvars)=maxdepth OR le(thisans) OR thisout`exit OR prune(dirvars, newacc1, thisans) THEN
  thisout
ELSE
  LET
    (dir, v)   = select(dirvars, newacc1, dom, nobj),
    funsplit   = branch(v, nobj),
    domsplit   = subdivide(v, dom),
    (sp1, sp2) = IF dir THEN (funsplit`1, funsplit`2) ELSE (funsplit`2, funsplit`1) ENDIFF,
    (dom1, dom2) = IF dir THEN (domsplit`1, domsplit`2) ELSE (domsplit`2, domsplit`1) ENDIFF,
    firstout   = branch_and_bound(simplify, evaluate, branch, subdivide, denorm, combine,
                                  prune, le, ge, select, accumulate, maxdepth)
                                  (sp1, dom1, Some(newacc1), pushDirVar((dir, v), dirvars))
  IN
  IF firstout`exit THEN
    mk_out(combine(v, denorm((dir, v), firstout`ans), thisans),
            TRUE, firstout`depth, firstout`splits+1)
  ELSE
    LET
      newacc2   = accumulate(FALSE, newacc1, firstout`ans),
      secondout = branch_and_bound(simplify, evaluate, branch, subdivide, denorm, combine,
                                   prune, le, ge, select, accumulate, maxdepth)
                                   (sp2, dom2, Some(newacc2), pushDirVar((NOT dir, v), dirvars)),
      (real1, real2) = IF dir THEN (firstout, secondout) ELSE (secondout, firstout) ENDIFF
    IN
      mk_out(combine(v, denorm(left(v), real1`ans), denorm(right(v), real2`ans)),
              secondout`exit,
              max(firstout`depth, secondout`depth),
              firstout`splits+secondout`splits+1)
    ENDIFF
  ENDIFF
MEASURE maxdepth-length(dirvars)
```

- ▶ This algorithm can be evaluated by (eval-formula)
- ▶ ... and therefore, it can be used for computational reflection
- ▶ ... as long as everything it has to compute is a ground term

# Reflection



Yogi Berra: *"It aint over 'til it's over"*

**Interval** and **Bernstein** are not perfect

This algorithm may not terminate, even with **Interval** and **Bernstein**

There are some inequalities that are true that will not prove in a reasonable amount of time

THE END

THE END