

# Cylindrical Algebraic Decomposition in the RegularChains Library

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# Outline

- 1 Introduction
- 2 Functionality
- 3 Underlying theory and technical contribution
- 4 Experimentation
- 5 Application
- 6 Conclusion

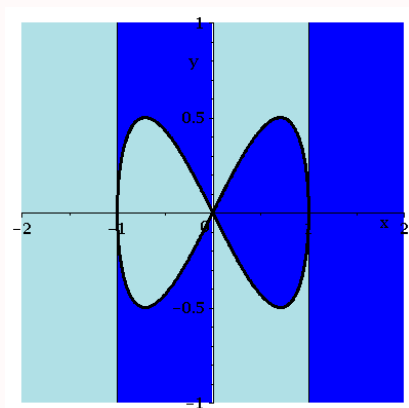
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## Cylindrical Algebraic Decomposition (CAD) of $\mathbb{R}^n$

A CAD of  $\mathbb{R}^n$  is a **partition** of  $\mathbb{R}^n$  such that each cell in the partition is a **connected semi-algebraic** subset of  $\mathbb{R}^n$  and all the cells are **cylindrically arranged**.

Two subsets  $A$  and  $B$  of  $\mathbb{R}^n$  are called **cylindrically arranged** if for any  $1 \leq k < n$ , the projections of  $A$  and  $B$  on  $\mathbb{R}^k$  are either **equal** or **disjoint**.



## Cylindrical algebraic decomposition based on projection and lifting

- Invented by G.E. Collins in 1973 for solving real Quantifier Elimination (QE) problems.
- The method is based on a projection-lifting scheme (PL-CAD).

**Projection:** Repeatedly apply a projection operator  $Proj$ :

$$F_n(x_1, \dots, x_n) \xrightarrow{Proj} F_{n-1}(x_1, \dots, x_{n-1}) \xrightarrow{Proj} \dots \xrightarrow{Proj} F_1(x_1).$$

**Lifting:**

- The real roots of the polynomials in  $F_1$  plus the open intervals between them form an  $F_1$ -invariant CAD of  $\mathbb{R}^1$ .
- For each cell  $C$  of the  $F_{k-1}$  invariant CAD of  $\mathbb{R}^{k-1}$ , isolating the real roots of the polynomials of  $F_k$  at a **sample point** of  $C$ , produces all the cells of the  $F_k$ -invariant CAD of  $\mathbb{R}^k$  above  $C$ .

**Best known software based on PL-CAD:** QEPCAD (H. Hong, C. Brown), Mathematica (A. Strzeboński), Redlog (A. Dolzmann, T. Sturm), SynRAC (H. Iwane, H. Yanami, H. Anai, and K. Yokoyama).

## Cylindrical algebraic decomposition based on regular chains (RC-CAD)

Motivation: potential drawback of Collins' projection-lifting scheme

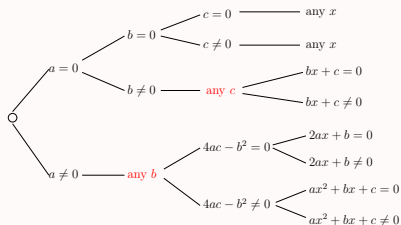
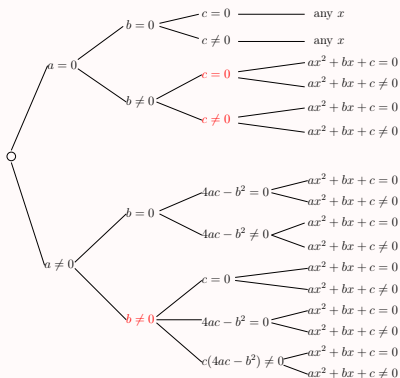
- The projection operator is a function defined independently of the input system.
- As a result, a strong projection operator (Collins-Hong operator) usually produces much more polynomials than needed.
- A weak projection operator (McCallum-Brown operator) may fail for non-generic cases.

Solution: make case discussion during projection

- At ISSAC'09, we (with B. Xia and L. Yang) introduced case discussion into CAD computation based on the theory of regular chains and triangular decompositions.
- The new method consists of two phases. The first phase computes a **complex cylindrical tree** (CCT). The second phase decomposes each cell of CCT into its real connected components.

## Illustrate PL-CAD and RC-CAD by parametric parabola example

Let  $f := ax^2 + bx + c$ . Suppose we like to compute a  $f$ -sign invariant CAD. The projection factors are  $a, b, c, 4ac - b^2, ax^2 + bx + c$ . Rethinking PL-CAD in terms of a *complex cylindrical tree*, we get the left tree.



Clearly, RC-CAD (see right tree) computes a smaller tree by *avoiding useless case distinction*.

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# Computer complex cylindrical decomposition by CylindricalDecompose

```
> R := PolynomialRing([y, x]):  
F := [y^2-x]:  
CylindricalDecompose(F, R, output=piecewise);
```

$$\begin{cases} \begin{cases} 1 & y = 0 \\ 1 & \textit{otherwise} \end{cases} & x = 0 \\ \begin{cases} 1 & -y^2 + x = 0 \\ 1 & \textit{otherwise} \end{cases} & \textit{otherwise} \end{cases}$$

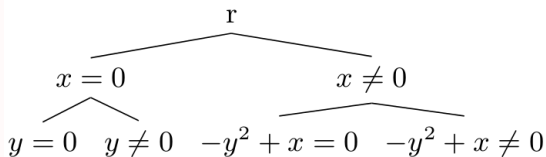


Figure: A complex cylindrical tree.

## Compute CAD by CylindricalAlgebraicDecompose.

```
> R := PolynomialRing([y, x]):  
F := [y^2-x]:  
CylindricalAlgebraicDecompose(F,R,output=piecewise);
```

$$\mathbb{R} \left\{ \begin{array}{ll} 1 & x < 0 \\ \left\{ \begin{array}{ll} 1 & y < 0 \\ 1 & y = 0 \\ 1 & 0 < y \end{array} \right. & x = 0 \\ \left\{ \begin{array}{ll} 1 & y < -\sqrt{x} \\ 1 & y = -\sqrt{x} \\ 1 & \text{And}(-\sqrt{x} < y, y < \sqrt{x}) \\ 1 & y = \sqrt{x} \\ 1 & \sqrt{x} < y \end{array} \right. & 0 < x \end{array} \right.$$

## Different input and output formats of CylindricalAlgebraicDecompose

```
> R := PolynomialRing([y, x]):  
cad := CylindricalAlgebraicDecompose([x^2+y^2-1=0, x*y-1/2=0],R,output=cadcell);  
Display(cad, R);  
sp := map(SamplePoints, cad, R);  
Display(sp, R);  
s := SignAtBox(x^2+y^2-2, sp[1], R);
```

*cad := [cad\_cell, cad\_cell]*

$$\left[ \left[ \begin{array}{l} y = \frac{1}{2}x \\ x = -\frac{1}{2}\sqrt{2} \end{array} \right], \left[ \begin{array}{l} y = \frac{1}{2}x \\ x = \frac{1}{2}\sqrt{2} \end{array} \right] \right]$$

*sp := [box, box]*

$$\left[ \left[ \begin{array}{l} y = \left[ -\frac{46341}{65536}, -\frac{1482907}{2097152} \right] \\ x = \left[ -\frac{46341}{65536}, -\frac{741455}{1048576} \right] \end{array} \right], \left[ \begin{array}{l} y = \left[ \frac{185363}{262144}, \frac{741457}{1048576} \right] \\ x = \left[ \frac{741455}{1048576}, \frac{46341}{65536} \right] \end{array} \right] \right]$$

*s := -1*

```
> R := PolynomialRing([y, x]):  
CylindricalAlgebraicDecompose([x^2+y^2-1<=0],R,output=  
rootof);  
↳ [[And(-1 ≤ x, x ≤ 1), And(-√(-x^2+1) ≤ y, y ≤ √(-x^2+1))]]
```

Group CAD cells together

## Different optimizations supporting CylindricalAlgebraicDecompose

- 'optimization=EC' : utilize equational constraints in single conjunction
- 'optimization=TTICAD', utilize equational constraints in multiple conjunction

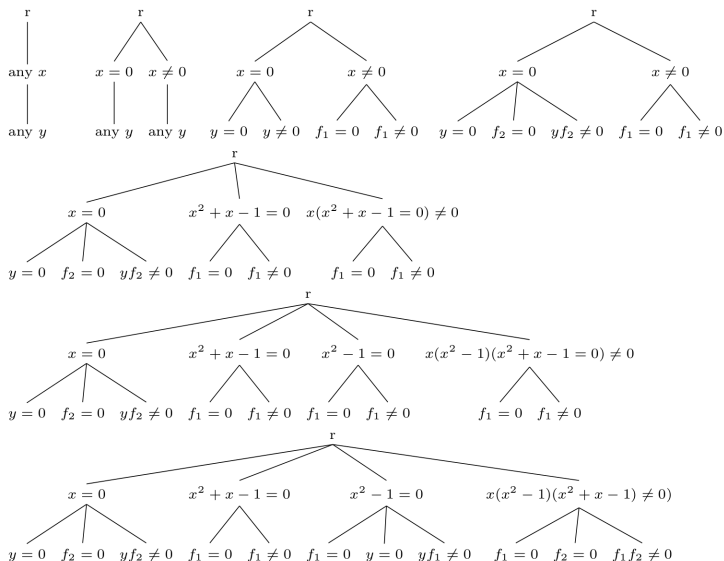
```
> p1 := randpoly([x, y, z], terms=4, degree=2, coeffs=rand(-2..2));
p2 := randpoly([x, y, z], terms=4, degree=2, coeffs=rand(-2..2));
g1 := randpoly([x, y, z], terms=4, degree=2, coeffs=rand(-2..2));
g2 := randpoly([x, y, z], terms=4, degree=2, coeffs=rand(-2..2));
      p1:= 2 x2 - 2 y2 - 2 z2 - x
      p2:= x2 + 2 y2 + z2 + x
      g1:= z2 + z
      g2:= 2 x y + x z - 2 y z
> R := PolynomialRing([z, y, x]):
> t0 := time():CylindricalAlgebraicDecompose([p1=0, p2=0, g1>0, g2>0], R,
optimization=false):t1 := time() - t0;
      t1:= 24.421
> t0 := time():CylindricalAlgebraicDecompose([p1=0, p2=0, g1>0, g2>0], R,
optimization=EC):t2 := time() - t0;
      t2:= 0.154
> t0 := time():CylindricalAlgebraicDecompose([[p1=0, g1>0], [p2=0, g2>0]], R,
optimization=false):t3 := time() - t0;
      t3:= 27.353
> t0 := time():CylindricalAlgebraicDecompose([[p1=0, g1>0], [p2=0, g2>0]], R,
optimization=TTICAD):t3 := time() - t0;
      t3:= 4.941
```

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## The process of computing a CCT (C. Chen, M. Moreno Maza, ASCM 2012)

Let  $F := \{y^2 - x, x^2 + y^2 - 1\}$ , where  $f_1 = y^2 - x$ ,  $f_2 = x^2 + y^2 - 1$ .



## The underlying data structure for computing CCT and CAD

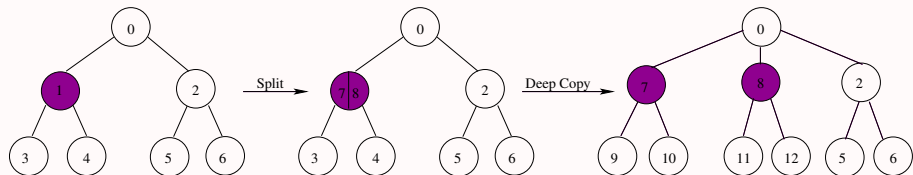


Figure: The universe tree and the Split operation.

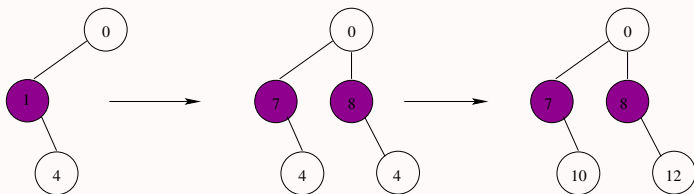


Figure: A sub-tree evolves with the universe tree.

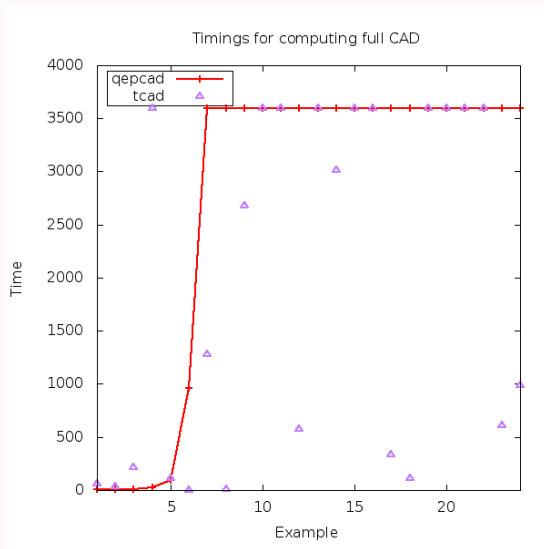
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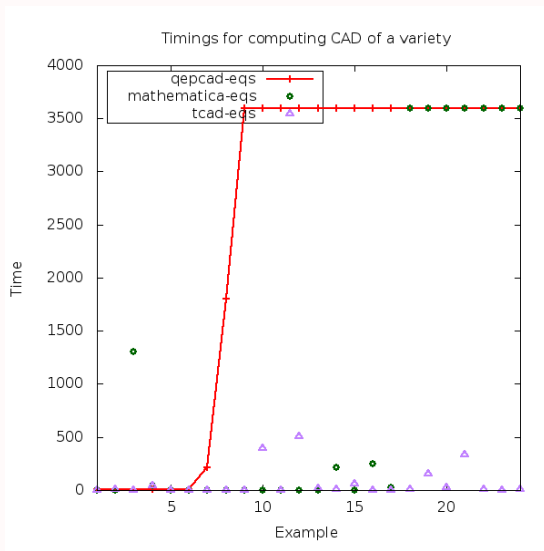
# Benchmark between QEPCAD and RC-CAD (TCAD) for computing full CADs

This is taken from ASCM 12 paper by C. Chen and M. Moreno Maza.



# Benchmark between QEPCAD, Mathematica and RC-CAD (TCAD) for computing CADs of a variety

This is taken from ASCM 12 paper by C. Chen and M. Moreno Maza.



# Benchmark between RC-TTICAD and other CAD solvers for computing CADs having equations (1/2)

This is taken from CASC 14 paper by R. Bradford, C. Chen, J. H. Davenport, M. England, M. Moreno Maza and D. J. Wilson.

Problem	n	RC-TTICAD		MATHEMATICA	QEPCAD		SYNRAC		REDLOG	
		Cells	Time	Time	Cells	Time	Cells	Time	Cells	Time
Intersection†	3	541	1.0	0.1	3723	4.9	3723	12.8	Err	—
Ellipse†	5	71231	317.1	11.2	500609	275.3	Err	—	Err	—
Solotareff†	4	2849	8.8	0.1	16603	5.2	Err	—	3353	8.6
Solotareff††	4	8329	21.4	0.1	16603	5.3	Err	—	8367	13.6
2D Ex†	2	97	0.2	0.0	249	4.8	317	1.1	305	0.9
2D Ex††	2	183	0.4	0.0	317	4.6	317	1.2	293	0.9
3D Ex†	3	109	3.5	0.1	739	5.4	—	T/O	Err	—
MontesS10	7	3643	19.1	T/O	—	T/O	—	T/O	Err	—
Wang 93	5	507	44.4	—	897.1	FAIL	—	Err	—	—
Rose†	3	3069	200.9	T/O	FAIL	—	—	T/O	Err	—
genLinSyst-3-2†	11	222821	3087.5	T/O	FAIL	—	Err	—	Err	—
BC-Kahan	2	55	0.2	0.1	261	4.8	409	1.5	Err	—
BC-Arcsin	2	57	0.1	0.0	225	4.8	225	0.7	161	2.4
BC-Sqrt	4	97	0.2	0.0	105	4.7	105	0.4	73	0.0
BC-Arctan	4	211	3.5	T/O	—	T/O	Err	—	—	T/O
BC-Arctanh	4	211	3.5	T/O	—	T/O	Err	—	—	T/O
BC-Phisanbut-1	4	325	0.8	0.1	377	4.8	389	2.0	217	0.2
BC-Phisanbut-4	4	543	1.6	11.9	51763	8.6	Err	—	Err	—

## Benchmark between RC-TTICAD and other CAD solvers for computing CADs having equations (2/2)

- Each problem had a declared variable ordering.
- RC-TTICAD never gives higher cell counts than any of our previous work (PL-TTICAD, PL-CAD CAD with McCallum projection, RC-Inc-CAD (ASCM 2012) RC-Rec-CAD (ISSAC 2019)).
- RC-TTICAD is usually the quickest in some cases offering vast speed-ups. Moreover, there are many examples where PL-TTICAD has a theoretical failure but for which RC-TTICAD will complete.
- TTICAD theory allows for lower cell counts than QEPCAD even when manually declaring an EC.
- We found that both SYNTRAC and REDLOG failed for many examples, but we did not have access to the latest SYNTRAC.
- MATHEMATICA is the quickest in general, but the output is a formula with a cylindrical structure, instead of a CAD; this cannot cover all applications like algebraic simplification by branch cut decomposition.
- Further, there are examples for which RC-TTICAD completes but MATHEMATICA times out.

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The following two challenges were posted in "Program verification in the presence of complex numbers, functions with branch cuts etc." by J. H. Davenport et al, 2012.

## Challenge

*Demonstrate automatically the truth of Formula 1 over reals.*

$$\forall x_1 \forall x_2 \forall y_1 \forall y_2 \quad (x_1^2 + y_1^2 > 1 \wedge x_2^2 + y_2^2 > 1 \wedge x_1 + \frac{x_1}{x_1^2 + y_1^2} = x_2 + \frac{x_2}{x_2^2 + y_2^2} \wedge y_1 - \frac{y_1}{x_1^2 + y_1^2} = y_2 - \frac{y_2}{x_2^2 + y_2^2} \implies (x_1 = x_2 \wedge y_1 = y_2)) \quad (1)$$

## Challenge

*Demonstrate automatically the truth of Formula 2 over reals.*

$$\forall x_1 \forall x_2 \forall y_1 \forall y_2 \quad (y_1 > 0 \wedge y_2 > 0 \wedge x_1 + \frac{x_1}{x_1^2 + y_1^2} = x_2 + \frac{x_2}{x_2^2 + y_2^2} \wedge y_1 - \frac{y_1}{x_1^2 + y_1^2} = y_2 - \frac{y_2}{x_2^2 + y_2^2} \implies (x_1 = x_2 \wedge y_1 = y_2)) \quad (2)$$

- Convert the universal QE problem to two existential QE problems

$$\forall \mathbf{x}(A \implies (B \wedge C)) \text{ iff } \neg \exists \mathbf{x} \neg (A \implies (B \wedge C)). \text{ iff } \neg \exists \mathbf{x} ((A \wedge \neg B) \vee (A \wedge \neg C))$$

- Use the option 'precondition'='TD' to precondition the input system by means of triangular decompositions.
- Use the option 'partial'='true' to enable partial lifting.

```

> t0 := time():
f_1 := x_1+x_1/(x_1^2+y_1^2)-(x_2+x_2/(x_2^2+y_2^2)):
f_2 := y_1-y_1/(x_1^2+y_1^2)-(y_2-y_2/(x_2^2+y_2^2)):
g_1 := numer(normal(f_1)): g_2 := numer(normal(f_2)):

sys := &not( (x_1^2+y_1^2-1>0) &and (x_2^2+y_2^2-1>0) &and (g_1=0) &and (g_2=0)
&implies ( (x_1=x_2) &and (y_1=y_2) ) ):
lsas := RegularChains(-TRDcadLogicFormulaToLsas(sys):
nops(lsas); sys1 := lsas[1]; sys2 := lsas[2]:

vars := SuggestVariableOrder(sys1): R := PolynomialRing(vars):
out1 := CylindricalAlgebraicDecompose(sys1, R, output=rootof, precondition='TD',
partial='true');

vars := SuggestVariableOrder(sys2): R := PolynomialRing(vars):
out2 := CylindricalAlgebraicDecompose(sys2, R, output=rootof, precondition='TD',
partial='true');

evalb( nops(out1)=0 and nops(out2)=0 ); t1 := time() - t0;
2
out1:= [ ]
out2:= [ ]
true
t1:= 55.197

```

## Solving the second challenge

```
> t0 := time():
f_1 := x_1+x_1/(x_1^2+y_1^2)-(x_2+x_2/(x_2^2+y_2^2)):
f_2 := y_1-y_1/(x_1^2+y_1^2)-(y_2-y_2/(x_2^2+y_2^2)):
g_1 := numer(normal(f_1)): g_2 := numer(normal(f_2)):

sys := &not( (y_1>0) &and (y_2>0) &and (g_1=0) &and (g_2=0) &implies ( (x_1=
x_2) &and (y_1=y_2) ) ):
lsas := RegularChains:-TRDcadLogicFormulaToLsas(sys):
nops(lsas); sys1 := lsas[1]: sys2 := lsas[2]:

vars := SuggestVariableOrder(sys1): R := PolynomialRing(vars):
out1 := CylindricalAlgebraicDecompose(sys1, R, output=rootof, precondition='TD',
partial='true');

vars := SuggestVariableOrder(sys2): R := PolynomialRing(vars):
out2 := CylindricalAlgebraicDecompose(sys2, R, output=rootof, precondition='TD',
partial='true');

evalb( nops(out1)=0 and nops(out2)=0 ); t1 := time() - t0;
2
out1 := [ ]
out2 := [ ]
true
t1 := 21.011
```



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## Summary and future work

- We have presented the command `CylindricalAlgebraicDecompose` of the `RegularChains` library.
- Yes, we should have better named it `CylindricallyAlgebraicDecompose` but most people who work around at Maplesoft or contribute to it are not native English speakers.
- The Maple library archive `RegularChains.mla` containing the latest version of `CylindricalAlgebraicDecompose` can be downloaded from [www.regularchains.org](http://www.regularchains.org)
- The `RealRootIsolate` command has been improved a lot as well as the CAD algorithm.
- The collaboration with the group at Bath U. has lead to the TTI-CAD option of `CylindricalAlgebraicDecompose` which is very effective.
- These improvements benefit to the `QuantifierElimination` command, see the experimentation in our ISSAC 2014 paper.
- Further work is required to get simpler output QFF and partial cylindrical algebraic decompositions.