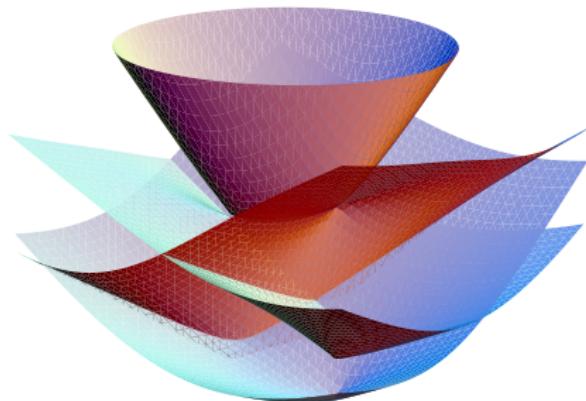
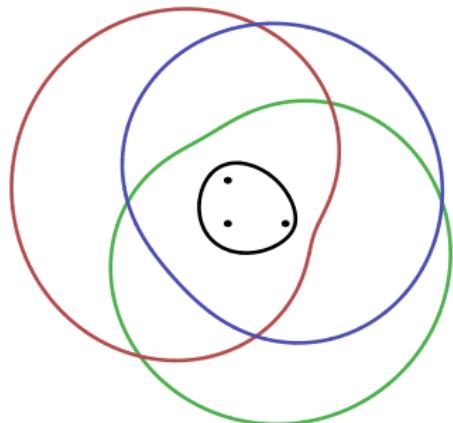


The Quadratic Equation Revisited

Bernd Sturmfels
MPI Leipzig



An Invitation to Non-Linear Algebra
General Audience Lecture
IHP Paris, October 11, 2023

Back in Ninth Grade

A quadratic equation has the form

$$ax^2 + bx + c = 0.$$

The letter x is the unknown.

The three quantities a, b, c are parameters. In applications, they are measurements from an experiment. They change many times.

How do we solve this equation?

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The teacher presents a general formula.

The students memorize that formula.

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The students memorize that formula.

Why do we solve this equation?

No clue.

The curriculum requires it.

Math class is totally boring....

The Formula

A general quadratic equation $ax^2 + bx + c = 0$ has two solutions:

$$x = \frac{-b \pm \sqrt{b^2 - 4ac}}{2a}.$$

The **discriminant** is the expression

$$D = b^2 - 4ac$$

There is a **case distinction** concerning the nature of the solution:

$$D > 0 \quad \text{oder} \quad D = 0 \quad \text{oder} \quad D < 0.$$

There are **almost** always two **complex** solutions.

The number of **real** solutions is

Two or one or zero.

Completing the Square

Derivation: The following equations are all equivalent:

$$ax^2 + bx + c = 0$$

$$ax^2 + bx = -c$$

$$ax^2 + bx + \frac{b^2}{4a} = \frac{b^2}{4a} - c$$

$$a\left(x + \frac{b}{2a}\right)^2 = \frac{b^2 - 4ac}{4a}$$

$$\left(x + \frac{b}{2a}\right)^2 = \frac{b^2 - 4ac}{4a^2}$$

$$x + \frac{b}{2a} = \frac{\pm\sqrt{b^2 - 4ac}}{2a}$$

$$x = -\frac{b}{2a} + \frac{\pm\sqrt{b^2 - 4ac}}{2a}$$

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What to do with polynomials in x of higher degree?

Numerical solutions, symbolic representations of the roots, ...

What to do with polynomials in several unknowns?

Gröbner bases, numerical algebraic geometry, ...

Math is Not Boring

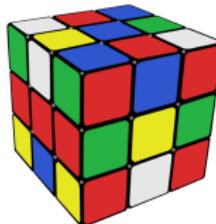
Mathematics is the language in which God has written the universe.

Galileo Galilei



Mathematicians are like Frenchmen: whatever you say to them they translate into their own language and forthwith it is something entirely different.

Johann Wolfgang von Goethe



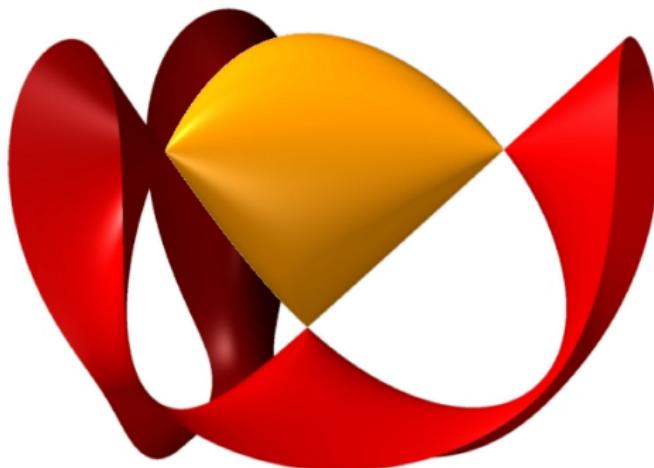
*Mathematics, rightly viewed, possesses not only truth, but **supreme beauty**.*

Bertrand Russell

Cayley's Cubic Surface

Logo of the Nonlinear Algebra Group at the
Max-Planck Institute for Mathematics in the Sciences

[Arthur Cayley, 1821-1895]



$$x^2 + y^2 + z^2 - 2xyz - 1 = 0$$

Optimization, Statistics,...

GRADUATE STUDIES
IN MATHEMATICS **211**



**Invitation to
Nonlinear Algebra**

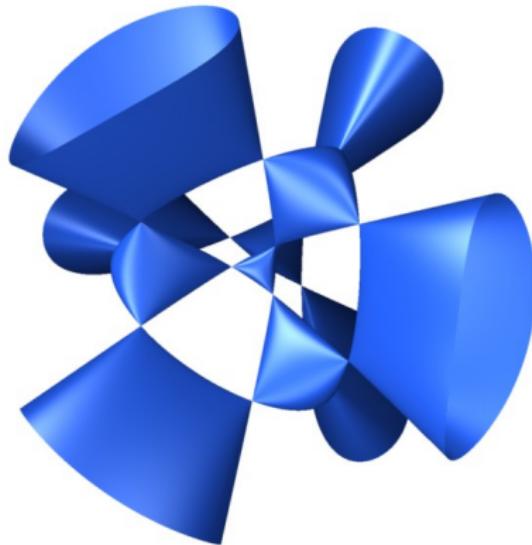
Mateusz Michałek
Bernd Sturmfels

Kummer's Quartic Surface

The equation

$$x^4 + y^4 + z^4 - x^2y^2 - x^2z^2 - y^2z^2 - x^2 - y^2 - z^2 + 1 = 0$$

describes a surface of degree four in \mathbb{R}^3 with 16 singular points:



[Ernst Eduard Kummer, 1810-1893]

Kummer surfaces have applications in **cryptography**.

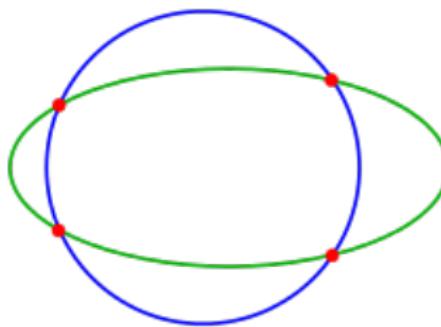
Varieties

The set of solutions to a system of polynomial equations in n variables is called a *variety* in \mathbb{R}^n . *"supreme beauty"*

Example: Quadratic curves in the plane ($n = 2$):

$$a_1 \cdot x^2 + a_2 \cdot xy + a_3 \cdot y^2 + a_4 \cdot x + a_5 \cdot y + a_6 = 0$$

Two quadratic equations in x und y ...



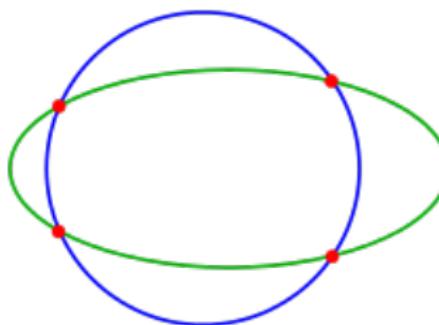
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Two quadratic equations in x und y ...



... have **almost** always four **complex** solutions. [Bézout 1764]

The **discriminant** is a polynomial in the coefficients.

It specifies the **case distinction**: 0,1,2,3 or 4 real solutions.

Discriminant

... has 3210 terms

256*a1^4*a3^2*u3^2*u6^4-128*a1^4*a3^2*u3*u5^2*u6^3+16*a1^4*a3^2*u5^4*u6^2-256*a1^4*a3*a5*u3^2*u5*u6^3+128*a1^4*a3*a5*u3*u5^3*u6^2-16*a1^4*a3*a5*u5^5*u6-512*a1^4*a3*a6*u3^3*u6^3+512*a1^4*a3*a6*u3^2*u5^2*u6^2-160*a1^4*a3*a6*u3*u5^4*u6+16*a1^4*a3*a6*u5^6+256*a1^4*a5^2*u3^3*u6^3-128*a1^4*a5^2*u3^2*u5^2*u6^2+16*a1^4*a5^2*u3*u5^4*u6-256*a1^4*a5*a6*u3^5*u6^2+128*a1^4*a5*a6*u3^2*u5^3*u6-16*a1^4*a5*a6*u3*u5^5+256*a1^4*a6^2*u3^4*u6^2-128*a1^4*a6^2*u3^3*u5^2*u6+16*a1^4*a6^2*u3^2*u5^4-128*a1^3*a2^2*a3*u3^2*u6^4+64*a1^3*a2^2*a3*u3*u5^2*u6^3-8*a1^3*a2^2*a3*u5^4*u6^2+64*a1^3*a2^2*a5*u3^2*u5*u6^3-32*a1^3*a2^2*a5*u3*u5^3*u6^2+4*a1^3*a2^2*a5*u5^5*u6+128*a1^3*a2^2*a6*u3^3*u6^3-128*a1^3*a2^2*a6*u3^2*u5^2*u6^2+40*a1^3*a2^2*a6*u3*u5^4*u6-4*a1^3*a2^2*a6*u5^6-256*a1^3*a2*a3^2*u3*u6^4+64*a1^3*a2*a3^2*u2*u5^2*u6^3+128*a1^3*a2*a3^2*u3*u6^4*u5*u6^3-32*a1^3*a2*a3^2*u4*u5^3*u6^2+128*a1^3*a2*a3*a4*u3^2*u5*u6^3-64*a1^3*a2*a3*a4*u3*u5^3*u6^2+8*a1^3*a2*a3*a4*u5^5*u6+256*a1^3*a2*a3*a5*u2*u3*u5*u6^3-64*a1^3*a2*a3*a5*u2*u5^3*u6^2+128*a1^3*a2*a3*a5*u3^2*u4*u6^3-192*a1^3*a2*a3*a5*u3*u4*u5^2*u6^2+40*a1^3*a2*a3*a5*u4*u5^4*u6+768*a1^3*a2*a3*a6*u2*u3^2*u6^3-512*a1^3*a2*a3*a6*u2*u3*u5^2*u6^2+80*a1^3*a2*a3*a6*u2*u5^4*u6-512*a1^3*a2*a3*a6*u3^2*u4*u5^6+320*a1^3*a2*a3*a6*u3*u4*u5^3*u6-48*a1^3*a2*a3*a6*u4*u5^5-256*a1^3*a2*a4*a5*u3^3*u6^3+128*a1^3*a2*a4*a5*u3^2*u5^2*u6^2-16*a1^3*a2*a4*a5*u3*u5^4*u6+128*a1^3*a2*a4*a6*u3^3*u5*u6^2-64*a1^3*a2*a4*a6*u3^2*u5^3*u6+8*a1^3*a2*a4*a6*u3*u5^5-384*a1^3*a2*a5^2*u2*u3^2*u6^3+128*a1^3*a2*a5^2*u2*u3*u5^2*u6^2-32*a1^3*a2*a5^2*u3*u4*u5^3*u6+384*a1^3*a2*a5*u6^2*u3^2*u5*u6^2-128*a1^3*a2*a5*u6^3+128*a1^3*a2*a5*a6*u3^3*u4*u6^2-192*a1^3*a2*a5*a6*u3^2*u4*u5^2*u6+40*a1^3*a2*a5*a6*u3*u4*u5^4-512*a1^3*a2*a6^2*u2*u3^3*u6^2+192*a1^3*a2*a6^2*u2*u3^2*u5^2*u6-16*a1^3*a2*a6^2*u2*u3*u5^4+128*a1^3*a2*a6^2*u3^3*u4*u5*u6-32*a1^3*a2*a6^2*u3^2*u4*u5^3-512*a1^3*a3^3*u1*u3*u6^4+128*a1^3*a3^3*u1*u5^2*u6^3+256*a1^3*a3^3*u1^2*u6^4-256*a1^3*a3^3*u2*u4*u5*u6^3+128*a1^3*a3^3*u3*u4^2*u6^3+32*a1^3*a3^3*u4^2*u5^2*u6^2+128*a1^3*a3^2*a4*u2*u3*u5*u6^3-32*a1^3*a3^2*a4*u2*u5^3*u6^2-512*a1^3*a3^2*a4*u2*u3*u5^2*u6^2-192*a1^3*a2*a4*u2*u3*u5^3*u6+768*a1^3*a3^2*a5*u1*u3*u5*u6^3-192*a1^3*a3^2*a5*u1*u5^3*u6^2-384*a1^3*a3^2*a5*u2^2*u5*u6^3+128*a1^3*a3^2*a5*u2*u3*u4*u6^3+352*a1^3*a3^2*a5*u2*u4*u5^2*u6^2-256*a1^3*a3^2*a5*u3*u4^2*u5*u6^2-32*a1^3*a3^2*a5*u4^2*u5^3*u6+512*a1^3*a3^2*a6*u1*u3^2*u6^3-640*a1^3*a3

Many Conics

3264 CONICS IN A SECOND

Paul Breining
Bernd Sturmfels
Sascha Timme



In 1848 Jakob Steiner asked
“**How many** conics are tangent to **five** conics?”
In 2019 we ask
“**Which** conics are tangent to **your five** conics?”



Curious to know the answer?
Find out at:
juliahomotopycontinuation.org/do-it-yourself/

Watching too much soccer on TV leads to hair loss?

296 people were asked about their hair length and how many hours per week they watch soccer on TV. **The data:**

		full hair	medium	little hair
U	≤ 2 hours	51	45	33
	2–6 hours	28	30	29
	≥ 6 hours	15	27	38

Is there a correlation between watching soccer and hair loss?

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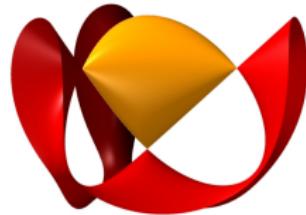
Is there a correlation between watching soccer and hair loss?

Extra info: Our study involved 126 men and 170 women:

$$U = \begin{pmatrix} 3 & 9 & 15 \\ 4 & 12 & 20 \\ 7 & 21 & 35 \end{pmatrix} + \begin{pmatrix} 48 & 36 & 18 \\ 24 & 18 & 9 \\ 8 & 6 & 3 \end{pmatrix}$$

We cannot reject the **null hypothesis**:

Hair length is conditionally independent of soccer on TV given gender.



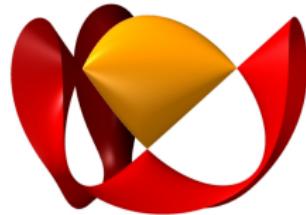
Philosophy: Statistical models are **varieties**.

Conditional independence of two ternary random variables:

This is the cubic hypersurface in \mathbb{R}^9 defined by

$$\det \begin{pmatrix} p_{11} & p_{12} & p_{13} \\ p_{21} & p_{22} & p_{23} \\ p_{31} & p_{32} & p_{33} \end{pmatrix} = 0.$$

Given any data matrix (u_{ij}) , one seeks to **maximize** the likelihood function $p_{11}^{u_{11}} p_{12}^{u_{12}} \cdots p_{33}^{u_{33}}$ over all points in this model.



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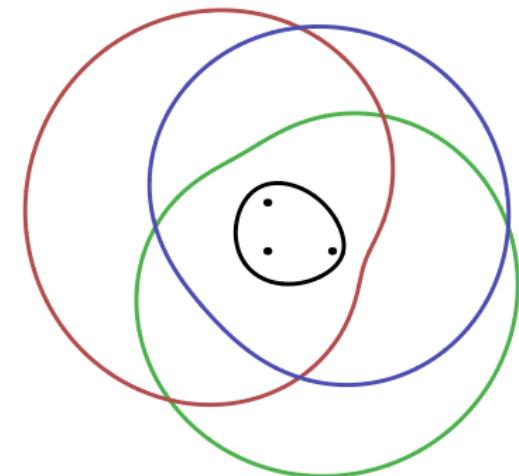
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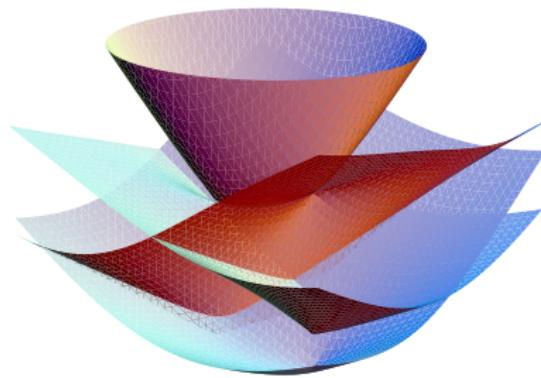
This leads to a system of polynomial equations. It has **almost** always 10 **complex** solutions. The **discriminant** is a polynomial in the data $u_{11}, u_{12}, \dots, u_{33}$. It specifies the **case distinction**.

Optimization

Here is a **3-ellipse**:



"supreme beauty"



This **variety** is an algebraic curve of degree 8.

If we vary the radius then we obtain a surface of degree 8.

Discriminant?

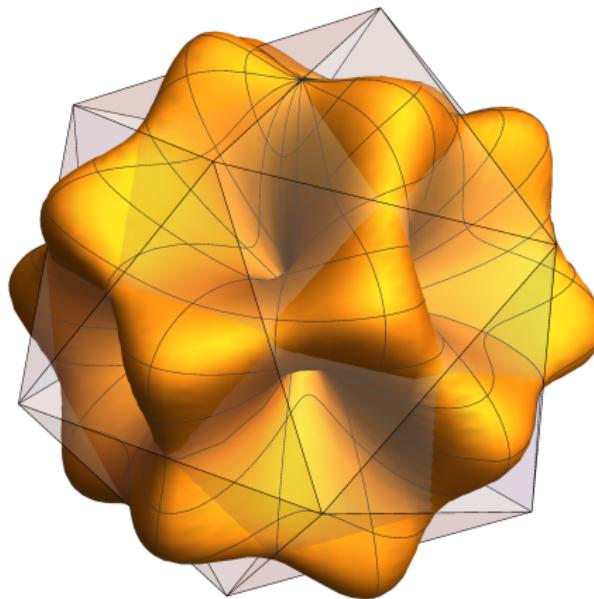
Case Distinction?

Symmetric Tensors of format $3 \times 3 \times 3 \times 3 \times 3 \times 3$

A ternary sextic has up to 20 local maxima on the sphere,
and up to 62 critical points ([eigenvectors](#)).

Example: [Morse complex](#) is the [icosahedron](#):

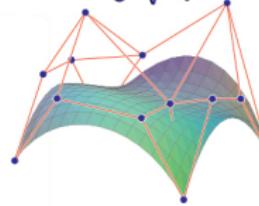
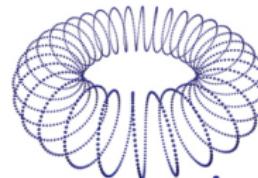
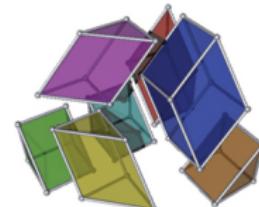
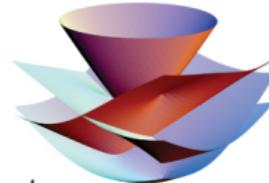
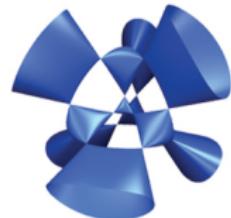
f-vector (12, 30, 20)



The [eigendiscriminant](#) has degree 150 in the 28 coefficients.

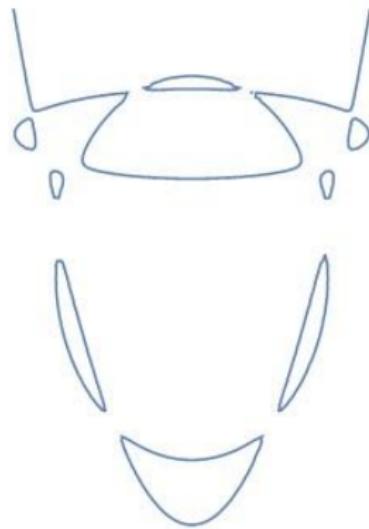
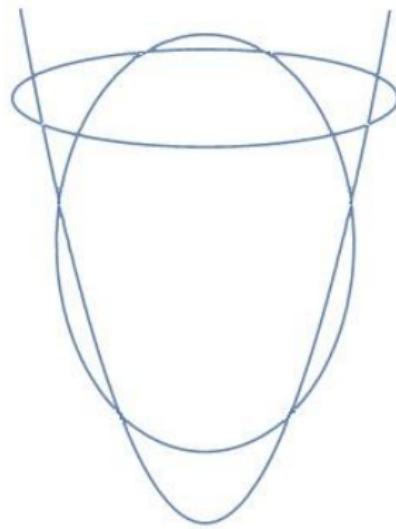
<http://www.siam.org/journals/siaga.php>

SIAM Journal on
**Applied Algebra
and Geometry**



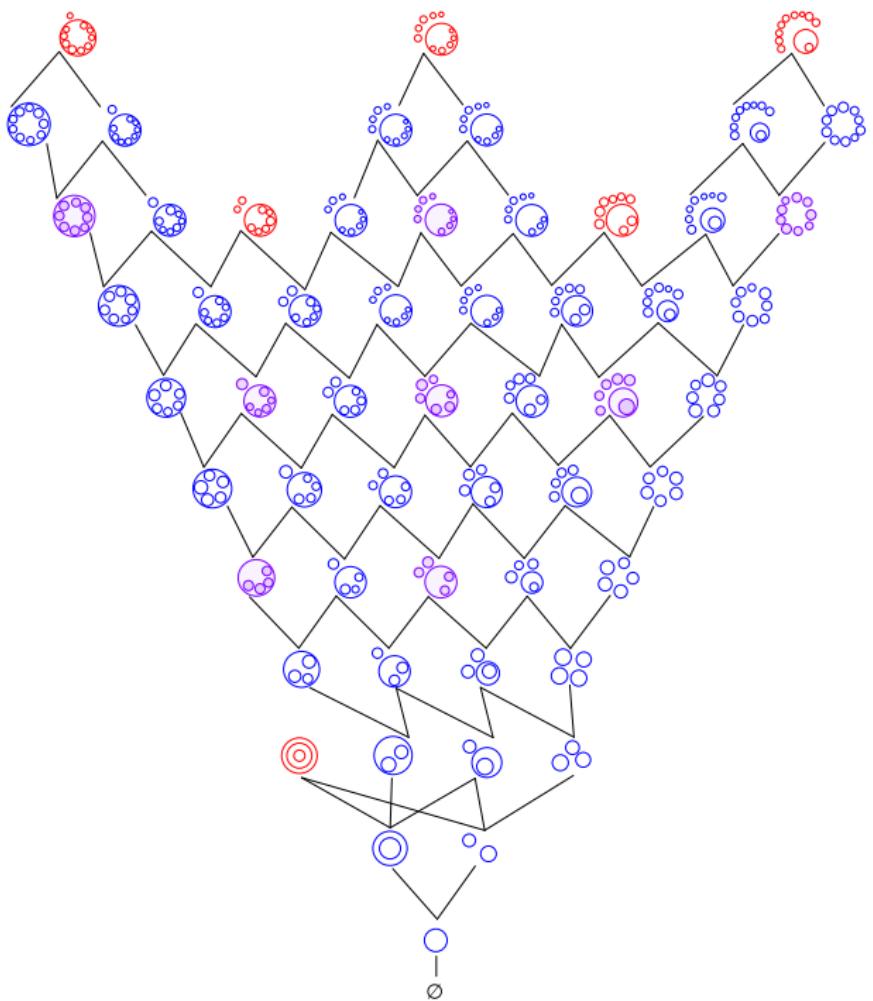
So many varieties, so little time

How to draw all possible **curves of degree 6 in the plane?**



A big **discriminant** furnishes the **case distinction**.

Curves



Projective Plane

A *line* in the plane $\mathbb{P}_{\mathbb{R}}^2$ is the zero set of a linear form

$$f = c_1x + c_2y + c_3z.$$

Quiz: What do you get by removing a line from the plane $\mathbb{P}_{\mathbb{R}}^2$?

Projective Plane

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Quiz: What do you get by removing a line from the plane $\mathbb{P}_{\mathbb{R}}^2$?

A *conic* in the plane $\mathbb{P}_{\mathbb{R}}^2$ is the zero set of a quadratic form

$$f = c_1x^2 + c_2xy + c_3xz + c_4y^2 + c_5yz + c_6z^2.$$

A conic is either an oval or empty, depending on the **discriminant**

$$\det \begin{pmatrix} 2c_1 & c_2 & c_3 \\ c_2 & 2c_4 & c_5 \\ c_3 & c_5 & 2c_6 \end{pmatrix}$$

Quiz: What do you get by removing a conic from the plane $\mathbb{P}_{\mathbb{R}}^2$?

A Big Discriminant

A **sextic** in $\mathbb{P}_{\mathbb{R}}^2$ is the zero set of

$$f = c_1x^6 + c_2x^5y + c_3x^5z + c_4x^4y^2 + c_5x^4yz + \cdots + c_{28}z^6$$

The **discriminant** of f is a polynomial Δ of degree 75 in the 28 coefficients $c_1, c_2, c_3, \dots, c_{28}$.

Can we give a formula?

A Big Discriminant

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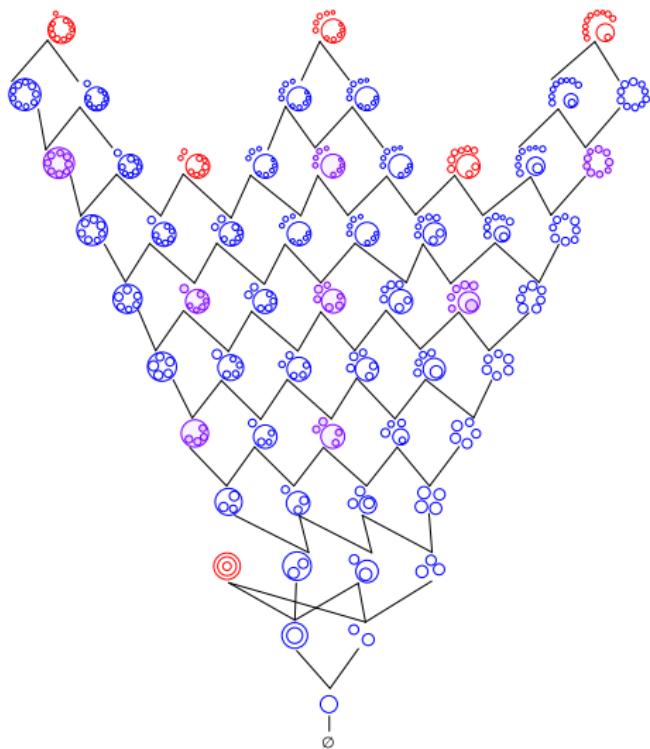
Hilbert's 16th Problem (1900):

Classify all algebraic curves of degree six in the plane $\mathbb{P}_{\mathbb{R}}^2$.

Theorem (Rokhlin-Nikulin Classification, 1980)

The complement of the discriminant hypersurface in $\mathbb{P}_{\mathbb{R}}^{27}$ has 64 connected components. The 64 rigid isotopy types are grouped into 56 topological types, with number of ovals ranging from 0 to 11.

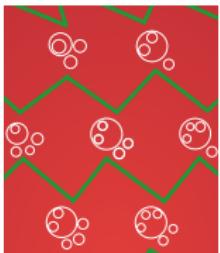
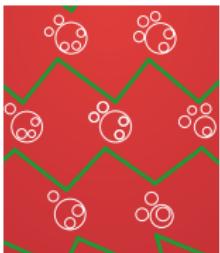
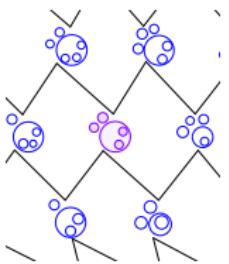
Blue, Red, Purple



Corollary

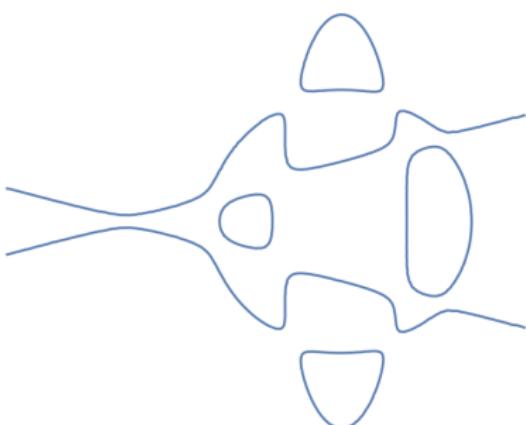
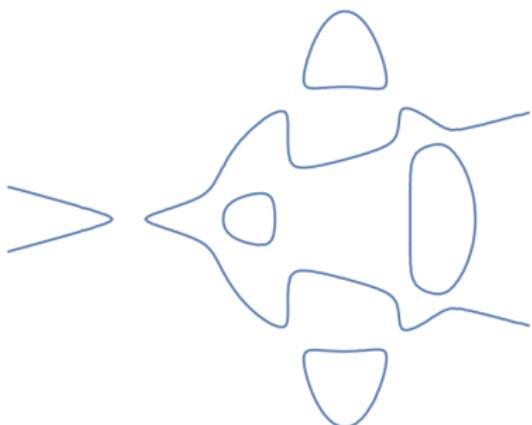
Of the 56 topological types of smooth plane sextics, 42 types are non-dividing, six are dividing, and eight can be dividing or non-dividing. This accounts for all 64 rigid isotopy types in $\mathbb{P}_{\mathbb{R}}^{27} \setminus \Delta$.

Transitions

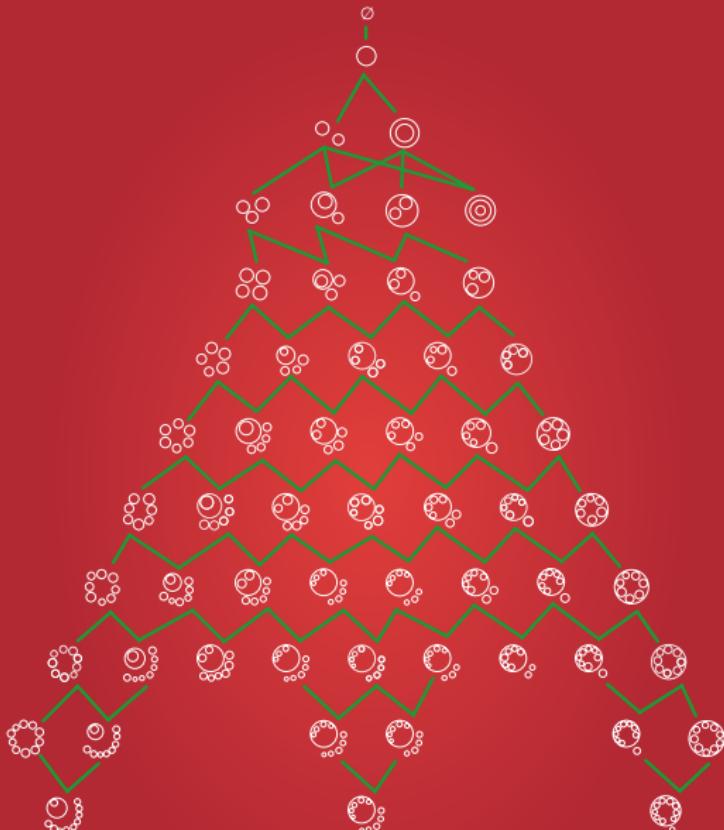


Theorem

For curves of even degree, every **discriminantal transition** between rigid isotopy types is one of the following: *shrinking an oval*, *fusing two ovals*, and *turning an oval inside out*.



2023



SEASON'S GREETINGS

AND A HAPPY NEW YEAR

Conclusion

The quadratic equation $ax^2 + bx + c = 0$ has two solutions:

$$x = \frac{-b \pm \sqrt{b^2 - 4ac}}{2a}.$$

The **discriminant** is the expression $D = b^2 - 4ac$.

It characterizes the **case distinction** for the nature of the solutions:

$$D > 0 \quad \text{or} \quad D = 0 \quad \text{or} \quad D < 0.$$

Conclusion

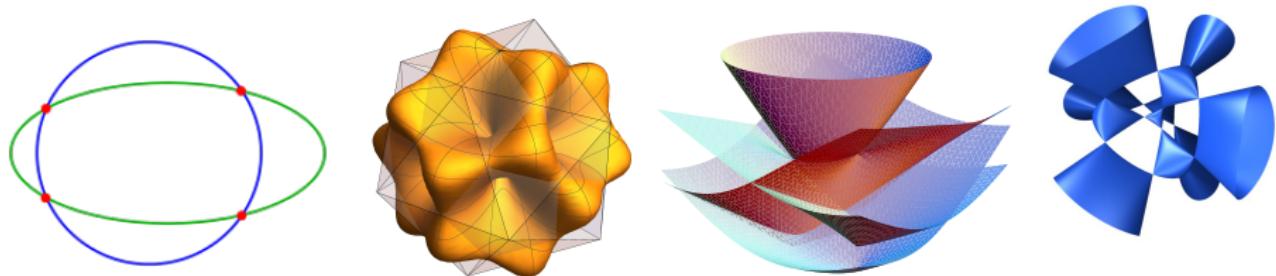
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Discriminants are everywhere. They are very important...

... and beautiful.

Not just in 9th grade.

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Check out my new book with [Kathlén Kohn](#) and [Paul Breiding](#) on

Metric Algebraic Geometry

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