

# FAIRMath: Making Mathematical Data FAIR (Findable, Accessible, Interoperable, Reusable)

**Joint work with:** Florian Rabe, Dennis Müller, Mihnea Iancu, Katja Bercic, Tom Wiesing...

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- ▶ Math Data wants to be deep FAIR (accessible semantics crucial)
- ▶ First steps towards deep FAIR infrastructures/hosting (MathDataHub)
- ▶ Future: (would be happy to collaborate with you all)
  - ▶ get funding for deep FAIR math data, (EOSC proposal FAIRMath rejected)
  - ▶ : stabilize MathDataHub, collect data sets and services,
  - ▶ extend these ideas to other sciences (the STEM disciplines)

# 1 Big Math and the One Brain Barrier

- ▶ **Observation 1.1.** In the last half decade mathematics tackles problems that lead to increasingly large developments: proofs, computations, data sets, and document collections.
- ▶ **Consequence:** Intense discussions about the nature of mathematics
  1. Is a proof that can only be verified with the help of a computer still a mathematical proof? (Appel&Haken '76)
  2. Is a mathematical proofscape that exceeds what can be understood in detail by a single expert a legitimate justification of a mathematical result? (CFSG)
  3. Can a collection of mathematics papers — however big — adequately represent a large body of mathematical knowledge? (DML)
- ▶ **Definition 1.2.** Let us call such large developments **Big Math**— and the (uncontroversial) rest **Pen Math**.

## E.g.: The Classification of Finite Simple Groups (CFSG)

- ▶ The CFSG is one of the seminal results of 20<sup>th</sup> century mathematics.
- ▶ Its status is similar to that of the fundamental theorem of arithmetic.
- ▶ Its proof was constructed by a large community over  $\geq 50$  years (last special cases completed in 2004)
- ▶ The CFSG proof spans  $\geq 100$  articles ( $\geq 10,000$  pp)
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- ▶ **Observation 1.3.** The traditional way of “doing Math”  $\hat{=}$ 
  - ▶ well-trained, highly creative individuals deriving insights with “pen and paper”,
  - ▶ report on them in community meetings, and publishing them in academic journals or monographs.

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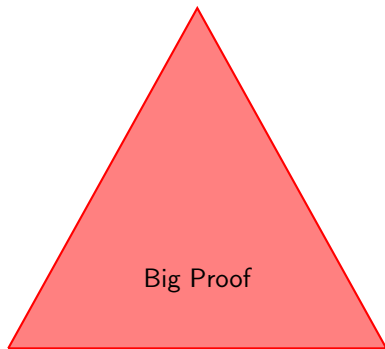
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- is reaching its natural limits posed by the amount of mathematical knowledge that can be held in a single human brain  $\rightsquigarrow$  the **one-brain barrier** (OBB)
- ▶ OBB can be generalized to **small-group-brain barrier** (but mind “The Mythical Man Month”)

# Classifying Math wrt. the One-Brain-Barrier

- ▶ A classification of mathematical developments.
  - ▶ Pen math: the developments and results that can be obtained by pen, paper, and university library by an individual or small group without too much strain on the process.
  - ▶ Big math: all that is beyond small math (i.e. straining the classical math process), but still inside the OBB
  - ▶ **Trans-OBB math**: all that is beyond bigmath but still amenable to the “method of proof”.
  - ▶ **Inaccessible math**: all results are are unprovable because of Gödel's incompleteness.
- ▶ The agenda of “Big Proofs/Big Math” must be to enabling big/trans-OBB math  
(leave inaccessiblemath alone)

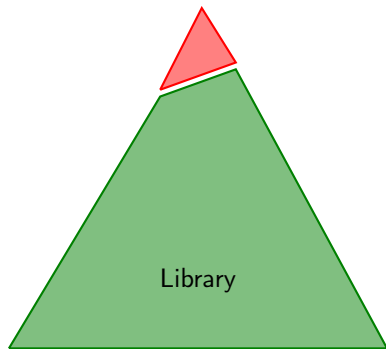
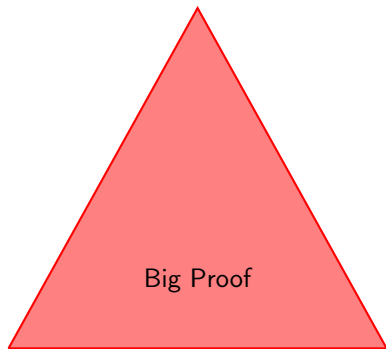
# Big Proof $\hat{=}$ Big Libraries + Little Proofs

- ▶ Proofs from first principles are prohibitively BIG.



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**Good Practice:** Explore theories, prove intermediate results, build mathematical components/tools.  
(Digital Mathematical Libraries)

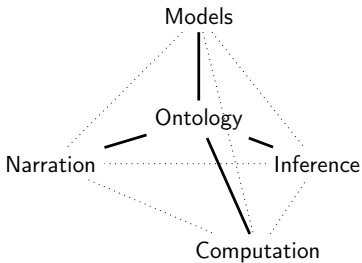
- ▶ libraries are a method to achieve **big knowledge** via **little proof!**

# Knowledge Representation is only Part of “Doing Math”

- ▶ One of the key insights is that the mathematics ecosystem involves a body of knowledge described as an **ontology** and four **aspects** of it:
  - ▶ **inference**: exploring theories, formulating conjectures, and constructing proofs
  - ▶ **computation**: simplifying mathematical objects, re-contextualizing conjectures. . .
  - ▶ **models**: collecting examples, applying mathematical knowledge to real-world problems and situations.
  - ▶ **narration**: devising both informal and formal languages for expressing mathematical ideas, visualizing mathematical data, presenting mathematical developments, organizing and interconnecting mathematical knowledge

# “Doing Math”: as a Tetrapod

- ▶ We call the endeavour of creating a computer-supported mathematical ecosystem “Project tetrapod” as it needs to stand on four legs.



Collaborators: [KWARC@FAU](mailto:KWARC@FAU), McMaster University

# The Tetrapod in the Big Proofs Workshop

- ▶ There are many single/dual-aspect systems, . . .
- ▶ some are mentioned here at the big proofs workshop
  - ▶ **ontology**: e.g. Paulson – see Ma, what I can inherit
  - ▶ **inference**: everyone of course
  - ▶ **computation**: e.g. Avigad – verification of computation,
  - ▶ **narration**: e.g. Hales/Köpke – CNL for human-readable FAbstracts
  - ▶ **tabulation**: Douglas – DBs in Physics

**Motivation 1** the tabulation (mathematical datasets/databases) aspect is the least represented here.



## 2 Motivation 2: Mathematical Research Data

# Research Data: A general Next Big Thing

- ▶ **Definition 2.1.** **Research data** is recorded factual material commonly retained by and accepted in the scientific community as necessary to validate research findings.
- ▶ **Background:** Virtually all scientific funding agencies now require some kind of research data strategy (tendency: getting stricter)

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- ▶ **Definition 2.2 (Gold Standard Criteria).** Research data has to be **FAIR**, i.e.
  - ▶ **findable:** easy to identify and find for both humans and computers, e.g. with metadata that facilitate searching for specific datasets,
  - ▶ **accessible:** stored for long term so that they can easily be accessed and/or downloaded with well-defined access conditions, whether at the level of metadata, or at the level of the actual data,
  - ▶ **interoperable:** ready to be combined with other datasets by humans or computers, without ambiguities in the meanings of terms and values,
  - ▶ **reusable:** ready to be used for future research and to be further processed using computational methods.

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**Questions:** What does this mean for mathematics, in particular

- ▶ ▶ What is mathematical research data?
- ▶ ▶ How can we make mathematical data fair?

- ▶ **NFDI**: In November 2018 the federal/state governments agreed to establishment of a **national initiative for research data**.
- ▶ **Funding**: 900 M€ over 10 years, afterwards institutional funding? (**research and competence/service, no hardware**)
- ▶ **Format**: ca. 30 Consortia who will form independent organizations.
- ▶ **Math4NFDI**: A consortium for Mathematical Research Data, (**Lead: WIAS Berlin**)
- ▶ **Current State of Play**: Networking, consortium consolidation, first NFDI call imminent.

# The European Open Science Cloud

- ▶ **EU Vision:** The EOSC will provide 1.7m EU researchers an environment with free, open services for data storage, management, analysis and re-use across disciplines.
- ▶ **Planned Architecture:** Federated meta-archive building on existing infrastructures: CERN, EMBL, ELIXIR, etc.
- ▶ **Chicken/Egg Problem:** how to get the EOSC off the ground?
  - ▶ There is only one mathematical data set on the EOSC (Jukka Kohonen's lattices)
- ▶ **Current State of Play:** some EOSC calls for implementation, data sets, services
- ▶ **Proposal FAIRMath:** from Jan 2019 was unsuccessful, disciplinary proposals apparently not appreciated.
- ▶ **But:** the FAIRMath proposal led to a clarification – for us – of Math Research Data

### 3 Mathematical Knowledge/Data Bases; State of the Art

The screenshot shows the Wikipedia article for "Elliptic curve". At the top left is the Wikipedia logo and navigation links. The article title "Elliptic curve" is prominently displayed. Below the title is a sub-header "From Wikipedia, the free encyclopedia". The main text begins with a note: "Not to be confused with *Ellipse*." It then defines an elliptic curve as a plane algebraic curve defined by an equation of the form  $y^2 = x^3 + ax + b$ . The text explains that the curve is non-singular if the discriminant is not zero. A 4x4 grid of diagrams illustrates various configurations of the curve based on the discriminant  $\Delta$  and the parameter  $a$ . A caption below the grid states: "A catalog of elliptic curves. Region shown is  $[-3,3]^2$  (For  $(a, b) = (0, 0)$ , the function is not smooth and therefore not an elliptic curve.)". Below the grid, the text discusses the connection between elliptic curves and the theory of elliptic functions, and mentions their application in cryptography and integer factorization. A small box at the bottom right of the article area contains the text "Algebraic structure → Group theory" and a diagram of a group structure.



- ▶ generic information systems
- ▶ informal mathematical document collections

(Wikipedia)

(Cornell preprint arXiv)

arXiv.org > math > arXiv:1711.02170

Search or Article ID  All papers

[\(Help\)](#) [Advanced search](#)

Mathematics > Number Theory

## On Elliptic Curves of prime power conductor over imaginary quadratic fields with class number one

John Cremona, Ariel Pacetti

*(Submitted on 6 Nov 2017)*

The main result of this paper is to generalize from  $\mathbb{Q}\sqrt{D}$  to each of the nine imaginary quadratic fields of class number one a result of Serre and Mestre-Oesterlé of 1989, namely that if  $E$  is an elliptic curve of prime conductor then either  $E$  is a 2-isogenous curve or a 3-isogenous curve has prime discriminant. The proof is conditional in two ways: first that the curves are modular, so are associated to suitable Bianchi newforms; and secondly that a certain level-lowering conjecture holds for Bianchi newforms. We also classify all elliptic curves of prime power conductor and non-trivial torsion over each of the nine fields: in the case of 2-torsion we find that such curves either have CM or with a small (finite) number of exceptions arise from a family analogous to the Setzer-Neumann family of elliptic curves over  $\mathbb{Q}\sqrt{D}$ .

Comments: 27 pages  
Subjects: [Number Theory \(math.NT\)](#)  
MSC classes: 11G05 (Primary), 14H52 (Secondary)  
Cite as: [arXiv:1711.02170 \[math.NT\]](#)  
(or [arXiv:1711.02170v1 \[math.NT\]](#) for this version)

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# Mathematical Knowledge Sources (MKS)

- ▶ generic information systems
- ▶ informal mathematical document collections
- ▶ literature information systems

(Wikipedia)  
(Cornell preprint arXiv)  
(zbMATH, MathSciNet)

zbMATH  Documents Authors Journals Classification Software Formulæ

Structured Search 

an:06802543  Fields ▾ Operators ▾

Help ▾

## Kriz, Igor

**On the arithmetic of elliptic curves and a homotopy limit problem.** (English) Zbl 06802543

**J. Number Theory** **183**, 466-484 (2018).

Summary: In this note, I study a comparison map between a motivic and étale cohomology group of an elliptic curve over  $\mathbb{Q}$  just outside the range of Voevodsky's isomorphism theorem. I show that the property of an appropriate version of the map being an isomorphism is equivalent to certain arithmetical properties of the elliptic curve.

### MSC:

11 Number theory

### Keywords:

elliptic curves; Tate-Shafarevich group; homotopy limit problem; motivic cohomology; étale cohomology

[BibTeX](#) [Cite](#)

Full Text: [DOI](#)

 WorldCat

### References:

- [1] Breuil, C.; Conrad, B.; Diamond, F.; Taylor, R., On the modularity of elliptic curves over  $\mathbb{Q}$ , or 3-adic exercises, J. amer. math. soc., 14, 849-939, (2001)
- [2] Deligne, P.; Deligne, P., La conjecture de Weil II, Publ. math. IHES, Publ. math. IHES, 52, 137-252, (1980)
- [3] Jannsen, U., Continuous étale cohomology, Math. ann., 280, 2, 207-245, (1988)

# Mathematical Knowledge Sources (MKS)

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- ▶ informal mathematical document collections (Cornell preprint arXiv)
- ▶ literature information systems (zbMATH, MathSciNet)
- ▶ mathematical object databases (GAP libraries, OEIS, LMFDB)

LMFDB Elliptic Curve Isogeny Class 11.a (Cremona lat)

Q → Elliptic curve → Q → 11 → a

Introduction and more

Introduction Universe News

Features Future Plans

Elliptic curves in class 11.a

| LMFDB label | Cremona label | Weierstrass coefficients   | Torsion order | Modular degree | O        |
|-------------|---------------|----------------------------|---------------|----------------|----------|
| 11.a.1      | 11a2          | [0, -1, 1, -7820, -263580] | 1             | 5              |          |
| 11.a.2      | 11a1          | [0, -1, 1, -10, -20]       | 5             | 1              | $F_{11}$ |
| 11.a.3      | 11a3          | [0, -1, 1, 0, 0]           | 5             | 5              |          |

Rank

The elliptic curves in class 11.a have rank 0.

Modular form 11.2.1.a

$$q - 2q^2 - q^3 + 2q^4 + q^5 + 2q^6 - 2q^7 - 2q^8 - 2q^{10} + q^{11} - 2q^{12} + 4q^{13} + 4q^{14} - q^{15} - 4q^{16} - 2q^{17} + \dots$$

Show more coefficients

Isogeny matrix

$$\begin{pmatrix} 1 & 5 & 25 \\ 5 & 1 & 5 \\ 25 & 5 & 1 \end{pmatrix}$$

Isogeny graph

Other GL(2) Classical Maass Hilbert Bianchi

Other GL(3) Maass

Other Slope

Varieties

Elliptic: /Q

NumberFields

Genus 2: /Q

This site is supported by donations to The OEIS Foundation.

THE ON-LINE ENCYCLOPEDIA OF INTEGER SEQUENCES®

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(Greetings from The On-Line Encyclopedia of Integer Sequences!)

A000045 Fibonacci numbers:  $F(n) = F(n-1) + F(n-2)$  with  $F(0) = 0$  and  $F(1) = 1$ . (Formerly M0692 N0256)

0, 1, 1, 2, 3, 5, 8, 13, 21, 34, 55, 89, 144, 233, 377, 610, 987, 1597, 2584, 4181, 6765, 10946, 17713, 28657, 46368, 75025, 121393, 196418, 317811, 514229, 832040, 1346269, 2178309, 3524578, 5702887, 9227465, 14930352, 24157817, 39088169 (list; graph; refs; history; text; internal format)

OFFSET 0,4

COMMENTS Also sometimes called Lamé's sequence.  $F(n+2)$  = number of binary sequences of length  $n$  that have no consecutive 0's.  $F(n+2)$  = number of subsets of  $\{1, 2, \dots, n\}$  that contain no consecutive integers.  $F(n+1)$  = number of tilings of a  $2 \times n$  rectangle by  $2 \times 1$  dominoes.  $F(n+1)$  = number of matchings (1,0-, Hosoya index) in a path graph on  $n$  vertices  $F(n)$ 's because the matchings of the path graph on the vertices A. R. C. D are the empty set. (ARI, FRI, FRI, FRI, FRI, FRI) = Euler

# Mathematical Knowledge Sources (MKS)

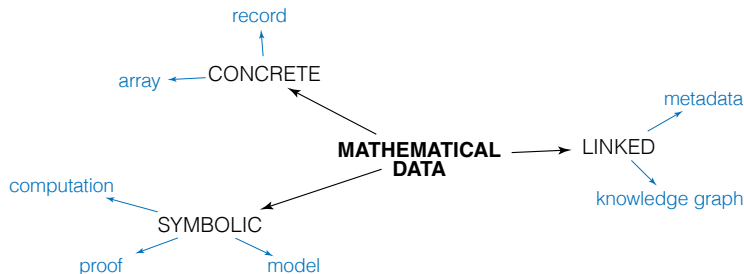
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- ▶ informal mathematical document collections (Cornell preprint arXiv)
- ▶ literature information systems (zbMATH, MathSciNet)
- ▶ mathematical object databases (GAP libraries, OEIS, LMFDB)
- ▶ formal theorem prover libraries (Mizar, Coq, PVS, HOL)
- ▶ We will concentrate on mathematical object databases here.

# FAIRness in Mathematics

- ▶ Mathematical research is becoming more data-driven (datasets for conjecture induction/testing)
- ▶ **But:** there is no accepted paradigm for producing/working with data sets
- ▶ **Observation 3.1.** There is a strong open-source/open-data ethos in most of the mathematical community (see e.g. the IMU resolutions and IMKT)
- ▶ **Consequence:** Mathematics is (somewhat) FAIR on the surface (we try to do the right thing)
- ▶ **But:** deep problems remain, e.g. (deep  $\hat{=}$  hard, deep  $\hat{=}$  below surface)
  - ▶ **accessible:** math objects have more and more varied internal structure than e.g. satellite images
  - ▶ **reusable:** no copy/paste from GAP to Sage to Lean (different encodings)
  - ▶ **interoperable:** e.g. dihedral group of order 8 is called  $D_4$  in Sage, but  $D_8$  in GAP.
  - ▶ **findable:** there are attempts at structural math search engines,...
- ▶ **Conjecture 3.2.** For mathematics, we need **deeply FAIR data practices**
  - ↪ math metadata are mathematical objects themselves.

# Types of Mathematical Data

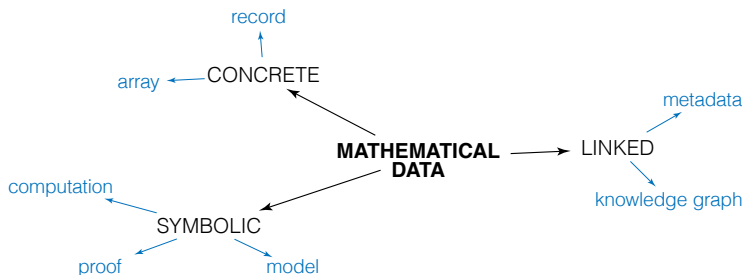
- ▶ We see three (or seven) kinds of mathematical data



- ▶ **Symbolic Data** can capture the full semantics of math objects by abstraction principles such as underspecification, quantification, and variable binding.
  - ↪ context-sensitive: moving expressions across environments difficult
  - ↪ F,I,R difficult (mitigate by standardization, e.g. MathML/OMDoc)

# Types of Mathematical Data

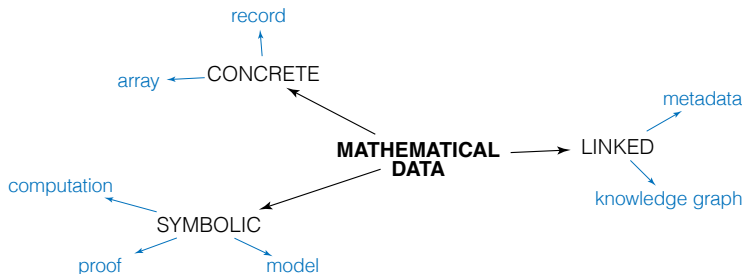
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- ▶ **Concrete data** employs representation theorems that allow encoding math. objects as simple data structures built from numbers, strings, lists, and records.
  - ~> Users have to know the repr. theorems to access data (often complex)
  - ~> FAIR difficult in practice (mitigate via documentation/Codex)

# Types of Mathematical Data

- ▶ We see three (or seven) kinds of mathematical data

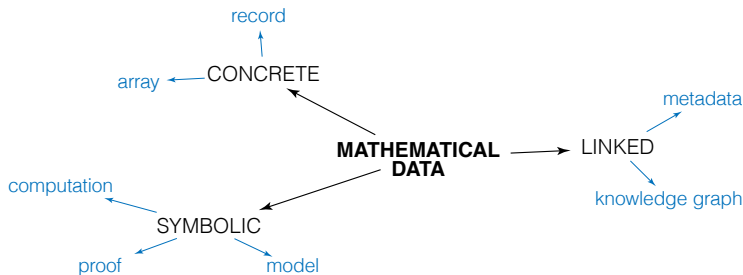


- ▶ **Linked data** introduces identifiers for objects and then treats them as blackboxes, only representing the identifier and not the original object.
  - ~> semantics of represented mathematical objects is partial,
  - ~> F/A limited, I/R subject to misinterpretation (use only as directed)



# Types of Mathematical Data

- ▶ We see three (or seven) kinds of mathematical data



| Kind of data                             | Symbolic | Concrete | Linked |
|--|----------|----------|--------|
| Allows recovering the represented object | +        | +        | -      |
| Applicable to all objects                | +        | -        | +      |
| Easy to process                          | -        | +        | +      |

# Programatic search in LMFDB

## ► Actual query:

<http://www.lmfdb.org/api/transitivegroups/groups/?cyc=1>



The screenshot shows the LMFDB API page for transitive groups with a cyclic order of 1. The page title is "API - transitivegroups/groups". The URL is [http://www.lmfdb.org/api/transitivegroups/groups/?\\_offset=0&cyc=1](http://www.lmfdb.org/api/transitivegroups/groups/?_offset=0&cyc=1). The page contains a search bar, a feedback link, and a menu. The main content area displays a list of groups in JSON format. The first group is `0. ObjectID('4e68db0a0eb55b70c8000000')` with properties `'ab': 1`, `'arith_equiv': 0`, `'auts': 1`, `'cyc': 1`, `'label': u'1T1'`, `'n': 1`, `'name': u'Trivial group'`, `'order': u'1'`, `'parity': 1`, `'pretty': u'Trivial'`, `'prim': 1`, `'repsns': []`, `'resolve': []`, `'solv': 1`, `'subs': []`, `'t': 1`. The second group is `1. ObjectID('4e8df0cc0eb55b03cc000000')` with properties `'ab': 1`, `'arith_equiv': 0`, `'auts': 12`, `'cyc': 1`, `'label': u'12T1'`, `'n': 12`, `'name': u'C(4)x(3)'`, `'order': u'12'`, `'parity': -1`, `'pretty': u'6C_12(3)'`, `'prim': 0`, `'repsns': []`, `'resolve': [[2, [2, 1]], [3, [3, 1]], [4, [4, 1]], [6, [6, 1]]]`, `'solv': 1`, `'subs': [[2, 1], [3, 1], [4, 1], [6, 1]]`, `'t': 1`. The third group is `2. ObjectID('4e68db140eb55b70c80000057')` with properties `'ab': 1`, `'arith_equiv': 0`, `'auts': 9`, `'cyc': 1`, `'label': u'9T1'`, `'n': 9`, `'name': u'C(9)'`, `'order': u'9'`, `'parity': 1`, `'pretty': u'6C_96'`, `'prim': 0`, `'repsns': []`, `'resolve': [[3, [3, 1]]]`, `'solv': 1`, `'subs': [[3, 1]]`, `'t': 1`.

## ► Desired query:

```
{x declared in 'lmfdb:db/transitivegroups?group | cyclic x ==* true }
```

# Semantics-aware Open Data and Deep FAIRness

- ▶ **Idea:** We need to keep the semantics near the data (legends in tables)
- ▶ **Current Practice:** add informal labels, e.g. “weight in kg.”
- ▶ **⚠:** This works only where the semantics is very simple  $\leadsto$  not in Math!
- ▶ **Example 3.3 (Often not even then).** In 2016 [ZieEreEIO:GeneErrors16], researchers found widespread errors in papers in genomics journals with supplementary MS Excel gene lists. About 20% of them contain erroneous gene name because the software misinterpreted string-encoded genes as months.
- ▶ **Remark 3.4.** In engineering, encoding mistakes can quickly become safety-critical, i.e., if a dataset of numbers is shared without their physical units, precision, and measurement type.
- ▶ **Example 3.5 (The Mars Orbiter).** NASA specified thruster in SI units, Contractor built thruster using PSI
- ▶ **Definition 3.6.** We speak of **accessible semantics** if data has metadata annotations that allow recovering the exact semantics of the data.
- ▶ **Observation 3.7.** With accessible semantics, datasets can be validated automatically against their semantic type to avoid such errors

- ▶ **Example 3.8.** We can reconstruct the (semantic) type *polynomial with integer coefficients* from its encoding *list of integers* only if its type and encoding function (*coefficients in order of decreasing degree*) are known.  
**But:** coefficient orders, sparse/dense, or multivariate polynomials.
- ▶ **Remark 3.9.** Without accessible semantics mathematical services can only operate on the dataset as a whole, we call them **shallow FAIR** services.
- ▶ **Definition 3.10.** We call a mathematical service **deep FAIR**, iff it operates on mathematical objects in a semantics-aware manner
- ▶ **Observation 3.11.** Meaningful mathematical services need to be deep FAIR.

- ▶ **Observation 3.12.** In our experience (in Math and elsewhere)
  - ▶ General data services are easy to build, iff they are shallow (general IT)
  - ▶ deep services are usually system-specific (where we have semantics)
- ▶ **Example 3.13.** shallow and deep FAIR services

| Service          | Shallow                  | Deep  |
|------------------|--------------------------|---|
| Identification   | DOI for a dataset        | DOIs for each entry                           |
| Provenance       | who created the dataset? | how was each entry computed?                  |
| Validation       | is this valid XML?       | does this XML represent a set of polynomials? |
| Access           | download a dataset       | download a specific fragment                  |
| Finding          | find a dataset           | find entries with certain properties          |
| Reuse            |                          | impractical without accessible semantics      |
| Interoperability |                          | impossible without accessible semantics       |

- ▶ **Observation 3.12.** In our experience (in Math and elsewhere)
  - ▶ General data services are easy to build, iff they are shallow (general IT)
  - ▶ deep services are usually system-specific (where we have semantics)
- ▶ **Remark 3.14 (Deep FAIR readiness of mathematical data).**

|          |  |            |               |          |
|----------|--|------------|---------------|----------|
| Data     | Findable   | Accessible | Interoperable | Reusable |
| Symbolic | Hard   | Easy       | Hard          | Hard     |
| Concrete | Impossible without access to the encoding function                     |            |               |          |
| Linked   | Easy, but only applicable to the small fragment with exposed semantics |            |               |          |

## 4 Deep/Shallow FAIR in practice

# Searching in in the LMFDB

- ▶ **Question:** Find all cyclic transitive groups

LMFDB Galois Groups → Search results

## Galois Group Search Result

Introduction and more  
Introduction Features  
Universe Future Plans  
News

L-functions  
Degree: 1 2 3 4  
ζ zeros

Modular Forms  
GL(2) Classical Maass  
Hilbert Bianchi  
GL(3) Maass  
Other Siegel

Varieties  
Elliptic:  
/Q

Parity:   Cyclic:  Solvable:  Primitive:

Degree:  t:

Maximum number of groups to display:

Results: (displaying all 23 matches)

| Label | Name           | Order | Parity | Solvable | Subfields | Low Degree Siblings |
|-------|----------------|-------|--------|----------|-----------|---------------------|
| 1T1   | Trivial        | 1     | 1      | Yes      |           |                     |
| 2T1   | C <sub>2</sub> | 2     | -1     | Yes      |           |                     |
| 3T1   | C <sub>3</sub> | 3     | 1      | Yes      |           |                     |
| 4T1   | C <sub>4</sub> | 4     | -1     | Yes      | 2T1       |                     |
| 5T1   | C <sub>5</sub> | 5     | 1      | Yes      |           |                     |
| 6T1   | C <sub>6</sub> | 6     | -1     | Yes      | 2T1, 3T1  |                     |
| 7T1   | C <sub>7</sub> | 7     | 1      | Yes      |           |                     |
| 8T1   | C <sub>8</sub> | 8     | -1     | Yes      | 2T1, 4T1  |                     |
| 9T1   | C <sub>9</sub> | 9     | 1      | Yes      | 3T1       |                     |

- ▶ **Problem:** But what if I want to compute with them?



► **Question:** Find all sequences starting with 0, 1, 1, 2, 3, 5, 8

[Hints](#)

(Greetings from [The On-Line Encyclopedia of Integer Sequences!](#))

Search: **seq:0,1,1,2,3,5,8**

Displaying 1-10 of 124 results found.

page 1 [2](#) [3](#) [4](#) [5](#) [6](#) [7](#) [8](#) [9](#) [10](#) ... [13](#)

Sort: relevance | [references](#) | [number](#) | [modified](#) | [created](#)    Format: long | [short](#) | [data](#)

[A000045](#)

Fibonacci numbers:  $F(n) = F(n-1) + F(n-2)$  with  $F(0) = 0$  and  $F(1) = 1$ .

+20

(Formerly M0692 N0256)

4044

**0, 1, 1, 2, 3, 5, 8, 13, 21, 34, 55, 89, 144, 233, 377, 610, 987, 1597, 2584, 4181, 6765, 10946, 17711, 28657, 46368, 75025, 121393, 196418, 317811, 514229, 832040, 1346269, 2178309, 3524578, 5702887, 9227465, 14930352, 24157817, 39088169** ([list](#); [graph](#); [refs](#); [listen](#); [history](#); [text](#); [internal format](#))

OFFSET

0,4

COMMENTS

Also sometimes called Lamé's sequence.

$F(n+2)$  = number of binary sequences of length  $n$  that have no consecutive 0's.

$F(n+2)$  = number of subsets of  $\{1,2,\dots,n\}$  that contain no consecutive integers.

$F(n+1)$  = number of tilings of a  $2 \times n$  rectangle by  $2 \times 1$  dominoes.

$F(n+1)$  = number of matchings (i.e., Hosoya index) in a path graph on  $n$  vertices:  $F(5)=5$  because the matchings of the path graph on the vertices  $A, B, C, D$  are the empty set,  $\{AB\}$ ,  $\{BC\}$ ,  $\{CD\}$  and  $\{AB, CD\}$ . - [Emeric Deutsch](#), Jun 18 2001

$F(n)$  = number of compositions of  $n+1$  with no part equal to 1. [Cayley, Grimaldi]

Positive terms are the solutions to  $z = 2*x*y^4 + (x^2)*y^3 - 2*(x^3)*y^2 - y^5 - (x^4)*y + 2*y$  for  $x,y \geq 0$  (Ribenboim, page 193). When  $x=F(n)$ ,  $y=F(n+1)$  and  $z > 0$  then  $z=F(n+1)$ .

For Fibonacci search see Knuth, Vol. 3; Horowitz and Sahni; etc.

# Our Goal here

- ▶ Provide a **Uniformal Interface** to Mathematical Knowledge Bases
  - ▶ a mathematical, programatic API
- ▶ **Idea:** Use OMDoc/MMT to represent semantics
  - ▶ we can make use of theory graphs
  - ▶ we already have the Math-In-The-Middle approach
- ▶ use the MMT system
  - ▶ MMT terms represent semantic objects
  - ▶ has a built-in query language **QMT**

## 5 Virtual Theories

# LMFDB Data (Database Level)

## ▶ Example 5.1 (A transitive group represented in LMFDB).

```
{
  "ab": 1,
  "arith_equiv": 0,
  "auts": 1,
  "cyc": 1,
  "label": "1T1",
  "n": 1,
  ...
}
```

**Legend:** for understanding them

(LMFDB improved documentation)

▶ the cyc field represents **being cyclic**

(0 is **false**, 1 is **true**)

▶ the n field represents **degree**

(IEEE Float 1 corresponds to  $1 \in \mathbb{N}$ )

▶ ...

**Two Problems:** that have to be solved for MitM integration

▶ ▶ data base schema is not at the mathematical level

(let alone interoperable)

▶ values are encoded for MongoDB convenience

(what do they mean?)

# Codecs: Encoding and Decoding Database Values

- ▶ **Definition 5.2 (Codec).** A codec consists of two functions that translate between **semantic types** and **realized types**.

Codecs

| Codecs                              |  |
|-------------------------------------|--|
| codec : type $\rightarrow$ type     |  |
| StandardPos : codec $\mathbb{Z}^+$  | JSON number if small enough, else JSON string of decimal expansion |
| StandardNat : codec $\mathbb{N}$    |  |
| ▶ StandardInt : codec $\mathbb{Z}$  |  |
| IntAsArray : codec $\mathbb{Z}$     | JSON List of Numbers   |
| IntAsString : codec $\mathbb{Z}$    | JSON String of decimal expansion                                   |
| StandardBool : codec $\mathbb{B}$   | JSON Booleans  |
| BoolAsInt : codec $\mathbb{B}$      | JSON Numbers 0 or 1  |
| StandardString : codec $\mathbb{S}$ | JSON Strings   |

- ▶ StandardInt decodes 1 into the float 1, but  $2^{54}$  into the string "18014398509481984"

# Elliptic Curve Code Operators

```
{
  "degree": 1,
  "x-coordinates of integral points": "[5,16]",
  "isogeny_matrix": "[[1,5,25],[5,1,5],[25,5,1]]",
  "label": "11a1",
  "_id": "Objectid('4f71d4304d47869291435e6e')",
  ...
}
```

- ▶ Matrix in the isogeny\_matrix field

- ▶ 
$$\begin{bmatrix} 1 & 5 & 25 \\ 5 & 1 & 5 \\ 25 & 5 & 1 \end{bmatrix}$$

- ▶ represented as  $[[1,5,25],[5,1,5],[25,5,1]]$

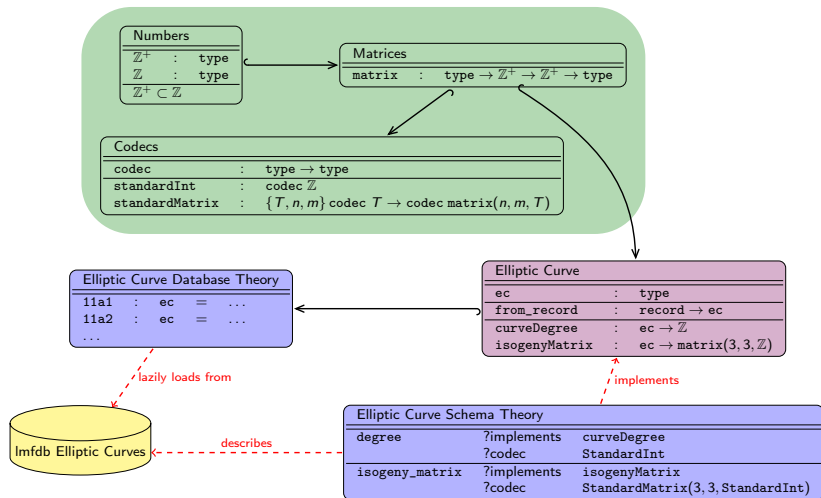
# Codec Operator Examples

- ▶ **Definition 5.3 (Codec Operator).** A codec operator is a function which takes a codec, a set of parameters, and returns a codec.
- ▶ Codecs (continued)

|  |  |
|--|--|
| $\text{StandardList} : \text{codec } T \rightarrow \text{codec List}(T)$           | JSON list, recursively coding each element of the list |
| $\text{StandardVector} : \text{codec } T \rightarrow \text{codec Vector}(n, T)$    | JSON list of fixed length $n$                          |
| $\text{StandardMatrix} : \text{codec } T \rightarrow \text{codec Matrix}(n, m, T)$ | JSON list of $n$ lists of length $m$                   |

- ▶  $\text{StandardMatrix}(\text{StandardInt}, 3, 3)$  generates the codec we used for the isogeny matrix

# Our approach: Virtual Theories





# An Example of a Query

- ▶ **Example 5.4.** Finding all cyclic transitive groups in LMFDB (recall from above)

```
x in (related to ( literal 'lmfdb:db/transitivegroups?group ) by (object declares))
| holds x (x cyclic x ** true)
```

- ▶ This example does not rely on the internal structure of LMFDB
- ▶ can be translated into an LMFDB query using the just-defined **codex theory**
- ▶ <http://www.lmfdb.org/api/transitivegroups/groups/?cyc=1>

## 6 MathDataHub: Hosting Math Datasets FAIRly

# MathDataHub: Hosting Math Datasets FAIRly

- ▶ **Problem:** for all math data sets (see <http://mathwb.mathweb.org> for a list)  
**MDH1** General data services are easy to build, iff shallow (general IT)  
**MDH2** deep services are usually system-specific (where we have semantics)  
In particular, systems/datasets are motivated by **MDH2** and flounder for **MDH1**
- ▶ **Idea:** Supply a deep FAIR infrastructure (**MDH1**) so that authors can concentrate on **MDH2**  $\leadsto$  **MathDataHub**. (share accessible semantics)
- ▶ **Technically:** Extend the virtual theories above to a **Math Data Definition Language MDDL** and generate **MathDataHub** infrastructure from that. (details in [**BerKohRab:tumdi19**])

# A simple Running Example

## ▶ Example 6.1 (Running Example).

- ▶ Joe has collected a set of integer matrices together with their trace, eigenvalues, and the Boolean property whether they are orthogonal for his Ph.D. thesis.
- ▶ he develops a MDDL description and submits it to MathDataHub.
- ▶ Jane, a collaborator of Joe's, is interested in characteristic polynomials of integer sequences.
- ▶ she develops a MDDL extension of Joe's.

| Joe's dataset                                   |              |            |            | Jane's column              |
|---|--------------|------------|------------|----------------------------|
| $M$   | $\text{Tr}M$ | Orthogonal | $\sigma_M$ | $\det(\lambda I - M)$      |
| $\begin{pmatrix} 2 & 0 \\ 0 & 1 \end{pmatrix}$  | 2            | yes        | 2, 1       | $\lambda^2 - 3\lambda + 2$ |
| $\begin{pmatrix} 2 & 1 \\ 1 & 2 \end{pmatrix}$  | 4            | no         | 3, 1       | $\lambda^2 - 4\lambda + 3$ |
| $\begin{pmatrix} -1 & 0 \\ 0 & 1 \end{pmatrix}$ | 0            | yes        | 1, -1      | $\lambda^2 - 1$            |

# A Glimpse of MDDL

## ► The DbData theory (simplified)

```
theory DbData : ur:?PLF =  
  db_tp : type |  
  db_val : db_tp → type | # V 1 prec -5 |  
  db_null : {a} V a |  
  db_int, db_bool, db_string, db_uuid : db_tp |  
  db_array : db_tp → db_tp |  
  eq : {a} V a → V a → V db_bool | # 1 = 2 | ...
```

# A Glimpse of MDDL

- ▶ The DbData theory (simplified)
- ▶ An excerpt from the MathData theory: collections

```
vector : type → ℤ → type |  
  # vector 1 2 prec 10 |  
empty : {a} vector a 0 |  
single : {a} a → vector a 1 |  
matrix : type → ℤ → ℤ → type |  
  = [a,m,n] vector (vector a m) n |  
option : type → type |  
some : {a} a → option a |  
none : {a} option a |  
getOrElse : {a} option a → a → a |
```

# A Glimpse of MDDL

- ▶ The DbData theory (simplified)
- ▶ An excerpt from the MathData theory: collections
- ▶ Joe's Schema Theory (simplified)

```
theory MatrixS : ?MDDL =  
  mat: matrix  $\mathbb{Z}$  2 2 | meta ?Codecs?codec MatrixAsArray IntIdent |  
    tag ?MDDL?opaque |  
  trace :  $\mathbb{Z}$  | meta ?Codecs?codec IntIdent |  
  orthogonal: bool | meta ?Codecs?codec BoolIdent |  
  eigenvalues : list  $\mathbb{Z}$  | meta ?Codecs?codec ListAsArray IntIdent |  
    tag ?MDDL?opaque |
```

# A Glimpse of MDDL

- ▶ The DbData theory (simplified)
- ▶ An excerpt from the MathData theory: collections
- ▶ Joe's Schema Theory (simplified)
- ▶ Joe runs MBGen on tyhis schema theory

| Column                    | Type       |
|---------------------------|------------|
| ID                        | uuid       |
| MAT                       | integer [] |
| TRACE                     | integer    |
| ORTHOGONAL                | boolean    |
| EIGENVALUES               | integer [] |
| Indexes: "MatrixS_pkey"   |            |
| PRIMARY KEY, btree ("ID") |            |

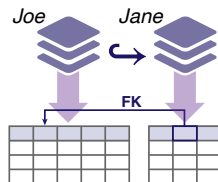
| ID                | mat        | trace | orthogonal | eigenvalues |
|-------------------|------------|-------|------------|-------------|
| e278b5e8-4404-... | {2,0,0,1}  | 2     | t          | {2,1}       |
| 05a30ff0-4405-... | {2,1,1,2}  | 4     | f          | {3,1}       |
| 1be3f022-4405-... | {-1,0,0,1} | 0     | t          | {1,-1}      |



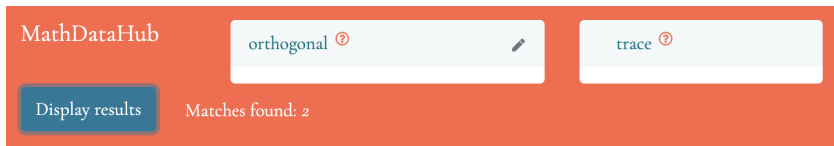
# A Glimpse of MDDL

- ▶ The DbData theory (simplified)
- ▶ An excerpt from the MathData theory: collections
- ▶ Joe's Schema Theory (simplified)
- ▶ Joe runs MBGen on tyhis schema theory
- ▶ Jane's Extensions are compiled into a table referencing Joe's

```
theory MatrixWithCharacteristicS : ?SchemaLang =  
  include ?MatrixS |  
  matrixID: int | meta ?SchemaLang?foreignKey ?MatrixS |  
  characteristic : Polynomial IntegerRing |  
  meta ?Codecs?codec PolynomialAsSparseArray IntIdent |
```



- ▶ The MDDL specifications have annotations that allow to generate modular UI code – here React.JS that interprets MMT-generated JSON.
- ▶ **Example 6.2 (Finishing the Running Example).**



MathDataHub

orthogonal ?

trace ?

Display results

Matches found: 2

| mat             | trace | orthogonal | eigenvalues |
|-----------------|-------|------------|-------------|
| [[2,0],[2,0]]   | 2     | true       | 2,I         |
| [[-1,0],[-1,0]] | 0     | true       | I,-I        |

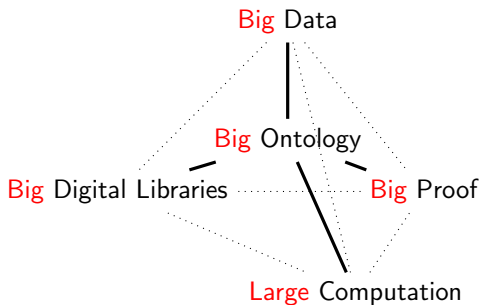
# Conclusions & Future Work (if I managed to get here)

---

- ▶ We are all interested in “Big Math”, not only “Big Proof”

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- ▶ We propose a tetrapodal model for “doing/supporting” mathematics



- ▶ Mathematical Research Data is a next big thing (FAIR principles)
- ▶ Math Data wants to be deep FAIR (accessible semantics crucial)

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- ▶ First steps towards deep FAIR infrastructures/hosting (MathDataHub)

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- ▶ We are all interested in “Big Math”, not only “Big Proof”
- ▶ We propose a tetrapodal model for “doing/supporting” mathematics
- ▶ Mathematical Research Data is a next big thing (FAIR principles)
- ▶ Math Data wants to be deep FAIR (accessible semantics crucial)
- ▶ First steps towards deep FAIR infrastructures/hosting (MathDataHub)
- ▶ Future: (would be happy to collaborate with you all)
  - ▶ get funding for deep FAIR math data, (EOSC proposal FAIRMath rejected)
  - ▶ : stabilize MathDataHub, collect data sets and services,
  - ▶ extend these ideas to other sciences (the STEM disciplines)