

# Aspects of Mathematical Knowledge



## The Tetrapod Model

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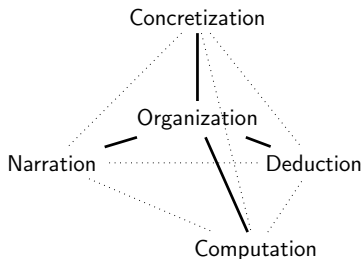
# 1 A Holistic Model for “Doing Math”; see [Car+21]

# Knowledge Representation is only Part of “Doing Math”

- ▶ **Definition 1.1.** One of the key insights is that the mathematics ecosystem involves a body of knowledge externalized in an **ontology** that provides **organization** and combines the following four **aspects**:
  - ▶ **Deduction**: exploring theories, formulating conjectures, and constructing proofs
  - ▶ **Computation**: simplifying mathematical objects, re contextualizing conjectures. . .
  - ▶ **Concretization**: collecting concrete examples/models, 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, McMaster University

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- ▶ **Organization:** We give the syntax/notation, possibly types, and possibly a definition/specification (so we remember)

```
theory natarith =  
  nat : type  
  plus : nat -> nat -> nat  
  ...
```

```
theory fibonacci =  
  include ?natarith  
  fib : nat -> nat | # F (1)  
  fib_base = ⊢ fib 0 = 1 ∧ fib 1 = 1  
  fib_step = ⊢ fib (n+2) = fib (n+1) + fib n
```

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$fib = [0, 1, 1, 2, 3, 5, 8, 13, 21, 34, 55, 89, 144, 233, 377, 610, 987, 1597, 2584, \dots]$

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*Fibonacci numbers are named after Italian mathematician Leonardo of Pisa, later known as Fibonacci. In his 1202 book Liber Abaci, Fibonacci introduced the sequence to Western European mathematics, although the sequence had been described earlier in Indian mathematics, as early as 200 BC in work by Pingala on enumerating possible patterns of Sanskrit poetry formed from syllables of two lengths.* [Wikipedia]



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- ▶ **Computation:** E.g. a python implementation

```
def fib():
```

```
    """ Generates the Fibonacci numbers, starting with 0 """
```

```
    x, y = 0, 1
```

```
    while 1:
```

```
        yield x
```

```
        x, y = y, x+y
```

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$$\forall n \in \mathbb{N}. F_n = \sum_{k=0}^{\lfloor \frac{n-1}{2} \rfloor} \binom{n-k-1}{k}.$$

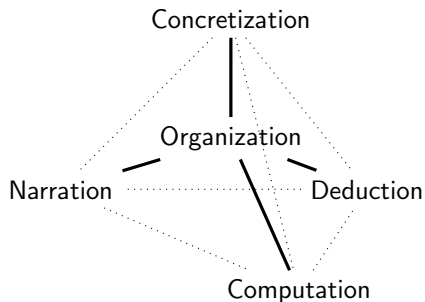
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- ▶ **Observation 1.8.**
  - ▶ *In traditional Maths, we effortlessly combine all of these.*
  - ▶ *In computational Maths, we use different formats and workflows.*
- ▶ **But:** There is great potential for the aspect-specific tools to interact synergistically! (Challenge for CICM)

## ► Example 1.9.

Aspect	KR Langs (examples)	KPTs (examples)
Organization	ontology languages (OWL), description logics (ALC)	reasoners, SPARQL engines (Virtuoso)
Concretization	relational databases (SQL, JSON)	databases (MySQL, Mon- goDb)
Computation	programming languages (C)	interpreters, compilers (gcc)
Deduction	logics (HOL)	theorem provers (Isabelle)
Narration	document languages (HTML, LaTeX)	editors, viewers

# Reminder: The TetraPod



## 2 The OEIS: Online Encyclopedia of Integer Sequences

- ▶ **Definition 2.1.** An **integer sequence** is a **function**  $s: \mathbb{N} \rightarrow \mathbb{Z}$ .
- ▶ **Applications:** Every parametric phenomenon that can be counted.
- ▶ **Example 2.2.** **A000944:** Number of polyhedra (or 3-connected simple planar graphs) with  $n$  nodes (0, 0, 0, 1, 2, 7, 34, 257, 2606, ...)
- ▶ **Example 2.3.** **A001222:** Number of prime divisors of  $n$  counted with multiplicity (0, 1, 1, 2, 1, 2, 1, 3, 2, 2, 1, 3, 1, 2, 2, ...)
- ▶ **Example 2.4.** **A031214:** First elements in all **OEIS** sequences (in order) (1, 1, 1, 0, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, ...)
- ▶ **Intuition:** If phenomena grow with the same sequence  $\leadsto$  related?
- ▶ **Idea:** Collect many integer sequences (Neil Sloane 1965  $\leadsto$  OEIS)
  - ▶ started as a book: *A Handbook of Integer Sequences* 1973 (2372 sequences)
  - ▶ online since 1994 (16.000 sequences  $\leadsto$  <http://oeis.org>)
  - ▶ **OEIS** Foundation: 2009 (Creative Commons License)
  - ▶ today:  $\geq 350\,000$  sequences

- ▶ One “record” per sequence with fields including

- ▶ Identifier: A???????

- ▶ start values

(DB Key)

- ▶ name (maybe with short explanation)

- ▶ author

- ▶ references to papers

- ▶ program code

(Mathematica, Pari, ...)

- ▶ **Formulae**

All in ASCII files keyed by one-letter line prefixes.

- ▶ **Example 2.5 (Fibonacci Numbers).**

```
%I A000045 M0692 N0256
```

```
%S A000045 0,1,1,2,3,5,8,13,21,34,55,89,144,233,377,610,987
```

```
%N A000045 Fibonacci numbers:  $F(n) = F(n-1) + F(n-2)$  with  $F(0) = 0$  and  $F(1) = 1$ .
```

```
%D A000045 V. E. Hoggatt, Jr., Fibonacci and Lucas Numbers. Houghton, Boston, MA, 1969.
```

```
%F A000045  $F(n) = ((1+\sqrt{5})^n - (1-\sqrt{5})^n) / (2^n \sqrt{5})$ 
```

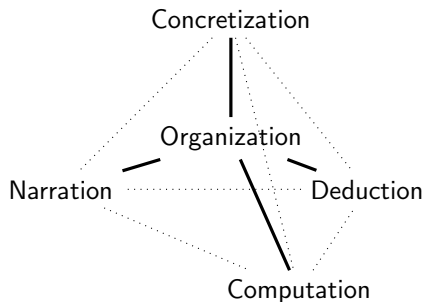
```
%F A000045 G.f.:  $\sum_{n \geq 0} x^n * \prod_{k=1..n} (k+x) / (1+k*x)$ . — Paul D. Harris
```

```
%F A000045 This is a divisibility sequence; that is, if  $n$  divides  $m$ , then  $a(n)$  divides  $a(m)$ 
```

```
%A A000045 _N. J. A. Sloane_, Apr 30 1991
```



# Reminder: The TetraPod



### 3 Charaterizing the Tetrapod

# The Tetrapod Aspects interact synergistically

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- ▶ **Organization** gives a uniform vocabulary and structure to the other four, e.g.
    - ▶ for disambiguating annotations in **narration**
    - ▶ as column legends in **concretization** schemata
    - ▶ for system interoperability between **computational** systems.
    - ▶ to collect all knowledge (theorems) about a concept (**deduction**)
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  - ▶ to collect all knowledge (theorems) about a concept (**deduction**)The other four aspects give additional “semantics” to **organization**.
- ▶ **Narration** occurs naturally as documentation of the other four, e.g.
  - ▶ as comments in programs (**computation**),
  - ▶ as introductions to theorems (**deduction**),
  - ▶ as row legends in **concretization** schemata,
  - ▶ as glossary explanations in **organization**.

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  - ▶ data for machine learning methods.

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- ▶ **Deduction** can justify
  - ▶ shortcuts in **computations**
  - ▶ completeness of **concretizations**.
- ▶ **But:** to reap these synergies we need
  - ▶ a combined – or at least linked – representation format
  - ▶ multi/cross-aspect tools.



# Complementary Advantages of the Aspects

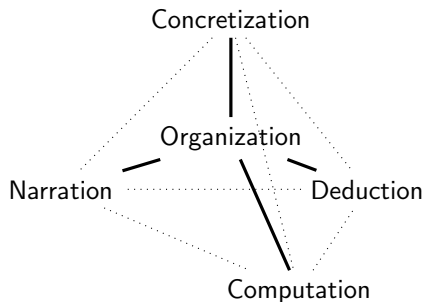
- Characterizing the Aspects: (corners and sides of the tetrahedron)

Aspect	objects	characteristic		
		advantage	joint advantage of the other aspects	application
ded. comp. concr. narr.	formal proofs programs concrete objects texts	correctness efficiency queriability flexibility	ease of use well-definedness abstraction formal semantics	verification execution storage/retrieval human understanding

- Characterizing the two-aspect systems (edges of the tetrahedron)

Aspect pair	characteristic advantage
ded./comp. narr./conc.	rich meta-theory simple languages
ded./narr. comp./conc.	theorems and proofs normalization
ded./conc. comp./narr.	decidable well-definedness Turing completeness

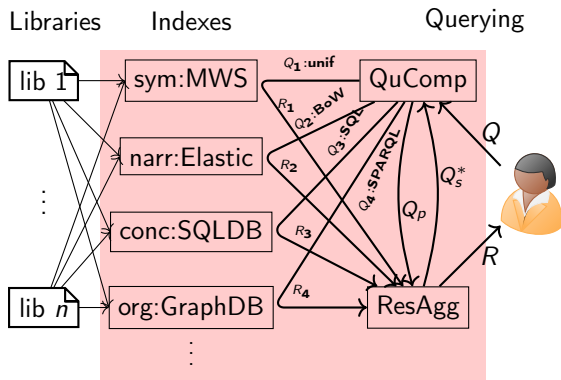
# Reminder: The TetraPod



## 4 Tetrapod some food for thought?

# Towards Tetrapodal Search

## ► An Architecture for Tetrapodal Search

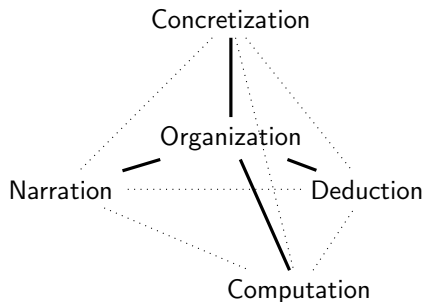


- ▶ **Documentation**: answers given as text
  - ▶ pro: easy to read for humans, critical to build intuitions
  - ▶ con: often ambiguous, contradictory, or incomplete
- ▶ **Specification**: correct answers defined by rule system (also called calculus or inference system)
  - ▶ pro: good stepping stone between the other two levels
  - ▶ con: accomplishes the pros of neither of them
- ▶ **Implementation**: answers computed by algorithm
  - ▶ pro: easy to automate, critical for efficiency and scale
  - ▶ con: essentially impossible to understand or analyze
- ▶ **Unit testing**: set of query/answer pairs
  - ▶ pro: easy to write, automate
  - ▶ con: does not cover the whole semantics

# Tetrapodal Aspects of Semantics – e.g. in Math/CS

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  - ≡ The **narration** aspect of semantics
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  - ▶ pro: easy to automate, critical for efficiency and scale
  - ▶ con: essentially impossible to understand or analyze
- ▶ **Unit testing**: set of query/answer pairs
  - ≡ The **concretization** aspect of semantics
  - ▶ pro: easy to write, automate
  - ▶ con: does not cover the whole semantics

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- [Car+21] Jacques Carette et al. “Big Math and the One-Brain Barrier – The Tetrapod Model of Mathematical Knowledge”. In: *Mathematical Intelligencer* 43.1 (2021), pp. 78–87. DOI: 10.1007/s00283-020-10006-0.