### An Online Repository of Mathematical Samples

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### Motivation

- Growing community working on recognition, parsing and digital exploitation of mathematical formulas
- Difficult to obtain data to reliably compare systems
- No collection of sample images of mathematical formulas readily available (exception: Suzuki's Ground Truth Set)
- We have currently plenty of images and are wondering what to do with them

- Categorise them and make them available
- Hoping for input from others
- Inspired by similar sets in other areas: TPTP, SAT-benchmarks

### Basic Idea

- Build a repository of math formula images
- Support the compilation of sample sets for testing and benchmarking
- Recognise scanned math, electronically born documents, some handwritten math

- Possibly distinguish with respect to different mathematical subjects
- Collect different result files for samples
- Support a community effort

### Data Overview

- Primary content are image files of formulas.
- Many will be clipped from single, larger documents.
- Each image will have several administrative files, some of them optional.

Sample File (Required)

TIFF or InkML file of a single formula or a page with formulae.

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- Sample File (Required)
  TIFF or InkML file of a single formula or a page with formulae.
- Provenance (Required)

The provenance and copyright information for the sample.

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- Provenance (Required)
  The provenance and copyright information for the sample.
- Source (Optional) The original document file from which the formula has been taken, e.g., PDF, Postscript, or multi-page TIFF

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 Clip file (Optional) Bounding box and position of glyphs in sample in JSON format. We have a tool to easily generate this.

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- Attribute File (Optional)

Tagging information for the sample necessary for retrieval.

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Tagging information for the sample necessary for retrieval.

Annotation Files (Optional)

User generated result files in different formats, e.g.  $\mbox{\sc BT}_{E}X,$  MathML, etc.

## Categorisation

- Sample files are categorised by attributes that enable their goal-directed retrieval.
- Recall our goal: Faciliate the compilation of samples for testing and benchmarking
- Software in question might have different usage
  - Recognise scanned math or electronically born documents

- Aimed at different mathematical subjects
- Retrieved set of images should be customisable
- Samples are assigned attributes with respect to
  - 1. image quality,
  - 2. semantic origin of the formula, and
  - 3. syntactic formula structure.

Each sample has exactly one attribute defining how much information is available for the recognition process.

- Perfect Information
- Rendered Image
- Scanned Image
- InkML

# **Quality Attributes**

Each sample has exactly one attribute defining how much information is available for the recognition process.

- Perfect Information
  - Contains information about the actual components of that formula, such as characters, fonts, etc.

- Examples are formulae in Postscript or PDF format.
- Rendered Image
- Scanned Image
- InkML

# **Quality Attributes**

Each sample has exactly one attribute defining how much information is available for the recognition process.

- Perfect Information
- Rendered Image
  - Some bitmapped image format.
  - No noise, skewing problems or other artifacts associated with optical scanning.
  - Typically electronically generated from a perfect information format.

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- Scanned Image
- InkML

Each sample has exactly one attribute defining how much information is available for the recognition process.

- Perfect Information
- Rendered Image
- Scanned Image
  - Bitmapped image originating from an optically scanned sample.

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- Can contain noise, skew, etc.
- InkML

# **Quality Attributes**

Each sample has exactly one attribute defining how much information is available for the recognition process.

- Perfect Information
- Rendered Image
- Scanned Image
- InkML
  - InkML file, containing the data (stroke path, pressure, etc.)
  - obtained from online handwriting input device, e.g. graphic tablet, electronic pen or pad computer.

### Semantic Attributes

- Each image has an attribute for its origin in some mathematical field
- Attribute refers to the field of the document the image belongs to
- ► We use the first two digits of the 2000 Mathematics Subject Classification
- For images of unknown origin we have a category Unclassified

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- Each sample can be tagged with a set of attributes.
- Express the structural composition of a mathematical formula.

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- Some attributes can be flagged as recursive.
- ► An image that is not annotated is assumed to be a simple formula. Example: a + b + 3 · c.

- Text
- Script
- Accents
- Fractions
- Containers
- Limits

- Fences
- ► Grids
- Cases
- Ellipses
- Multiline
- Commutative Diagrams

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- Text
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Limits

Text Formulae with interspersed text. e.g.,

a + b only when x = 0

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Text

Script Sub- or superscripts. e.g.,

### $a_3, a^4, a^4_3, \frac{1}{2}a^3_4, a_{i_3}$

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- Accents
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- Text
- Script
- Accents Mathematical accents like vectors etc. e.g.,

$$\vec{a}, \quad \dot{\vec{a}}, \quad \hat{a}$$

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- Fractions
- Containers
- Limits

Text

#### Script

Accents

► Fractions Formulae containing division bars. e.g.,

$$\frac{a}{b}$$
,  $\frac{a}{1+\frac{b}{c+d}}$ 

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Limits

Text

#### Script

- Accents
- Fractions
- Containers
  - Elements that fully contain another formula
  - Their vertical and horizontal extent is larger or equal to the contained formula
  - E.g. root symbols or boxes

$$\sqrt{a+b}, \quad \sqrt[i]{\sqrt{a+b}+c}$$

Limits

- Text
- Script
- Accents
- Fractions
- Containers
- Limits Elements with upper and/or lower limiting expressions. e.g.,

$$\sum_{i=1}^{n} n+i, \quad \lim_{n\to\infty} n$$

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- Fences
- Grids
- Cases
- Ellipses
- Multiline
- Commutative Diagrams

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#### Fences

- fencing or bracketing of some kind
- balanced (paired) or unbalanced (a single fence, or a 3 fence construct such as a set comprehension expression)
- also includes vertical fencing, e.g.under- or over-bracing or under- or over-lining

$$(A_y^x + B), \quad \{x \in X | p(x) \land q(x)\}, \quad \underbrace{n(n-1)\dots(n-m+1)}_{m \text{ factors}}$$

- Grids
- Cases
- Ellipses
- Multiline
- Commutative Diagrams

Fences

- Grids
  - two dimensional array structures
  - e.g., matrices, tables or combinatorial expressions

$$\begin{pmatrix} x \\ y \end{pmatrix}, \begin{bmatrix} 1 & 2 & 3 \\ a & b & c \end{bmatrix}$$

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- Cases
- Ellipses
- Multiline
- Commutative Diagrams

Fences

- Grids
- ► Cases Case statements. e.g.,

$$f(x) = \begin{cases} i & \text{if } x > 0\\ j & \text{otherwise} \end{cases}$$

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- Ellipses
- Multiline
- Commutative Diagrams

- Fences
- Grids
- Cases
- Ellipses
  - vertical, horizontal, diagonal or anti-diagonal
  - different types, e.g. vertically centred or on the baseline

$$a_1,\ldots,a_n, \quad a_1+\cdots+a_n, \quad \begin{bmatrix} a_{11} & \cdots & a_{1n} \\ & \ddots & \vdots \\ \mathbf{0} & & a_{nn} \end{bmatrix}$$

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- Multiline
- Commutative Diagrams

- Fences
- Grids
- Cases
- Ellipses
- Multiline Equations or similar formulae that span multiple lines.

$$x = a + b + b$$
$$= a + 2b$$

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Commutative Diagrams

- Fences
- Grids
- Cases
- Ellipses
- Multiline
- Commutative Diagrams as commonly found in algebra or category theory texts.



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### Software Tools

#### Clipping program

- PDF, Postscript or multipage TIFF input
- GUI to clip formulas from an image file
- Returns clip file in JSON format containing information like, glyph positions and bounding boxes
- ▶ We have about 1000 images, primarily clipped from PDF files
- We are putting together the web front-end to register and categorise samples
- We are developing an evaluation tool for rendered result files

#### Issues

- Quality assurance
  - How can we assure the quality of the structural annotations?
  - Restrict write access to the repository to registered users.
- Copyright issues
  - What about images from copyrighted material?
  - Using images for one's own experiments should be no problem.
  - But making them easily and freely available in large numbers might be a different matter.
  - Taking all formulas from a single book might exceed anything covered under fair use.
  - Intended solution: moderated submission to ensure we have valid free-use copyright agreements

## Conclusions

- Repository of Mathematical Samples as a service to the community
- Webinterface is currently under construction and should be available soon
- ► Will enable to contribute and categorise samples
- Categorisation is important as it should aid better testing, analysing and comparing systems

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- Copyright issues?
- We appreciate your input!