

High-Precision Semantics Extraction for Mathematics

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- MSc Student, Computer Science
- FAU (**F**riedrich-**A**lexander-**U**niversität Erlangen-Nürnberg)
(in Southern Germany)
- KWARC research group
 - Led by Michael Kohlhase
 - Knowledge representation and reasoning techniques
 - Focus on mathematical content

- A **S**emantic, **M**ultilingual **G**lossary of **M**athematics
- Definitions of mathematical terms
- Semantic information about dependencies

1714 words defined, the language coverage is:

English	94.0%
German	69.8%
Chinese (simplified)	8.5%
Romanian	3.5%
...	
Afrikaans	0.0%

... let's use GF!

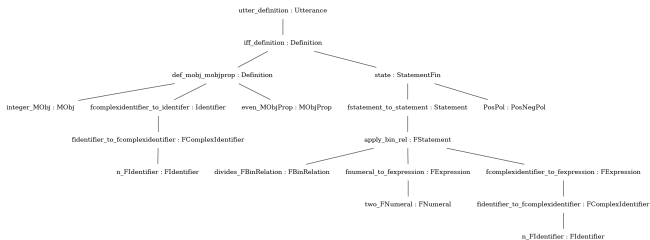
Example adapted from [GIJ⁺16]:

*“A non-empty **graph** G is said to be **connected**, if any two of its **nodes** are linked by a **path** in G .”*

*“Ein nicht-leerer **Graph** G heißt **zusammenhängend**, wenn je zwei seiner **Knoten** durch einen **Weg** in G verbunden sind.”*

“An integer n is called even iff $2|n$.”

⇓ **parse**

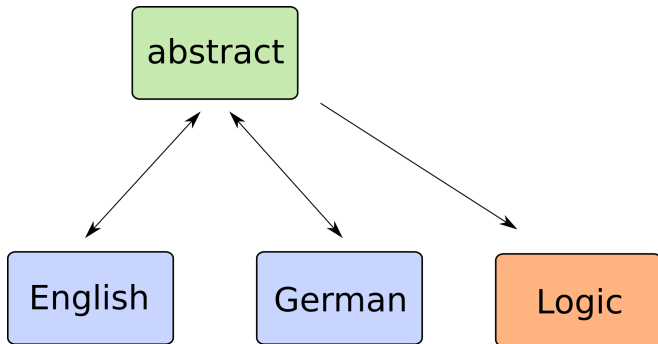


⇓ **linearize**

“Eine ganze Zahl n heißt gerade genau dann, wenn $2|n$.”

- Let's try to formalize sentences
- Example: $\forall n. \mathbf{int}(n) \Rightarrow (\mathbf{even}(n) \Leftrightarrow \mathbf{divides}(2, n))$
- I will present two different approaches

The formal representation is just another language:



"An integer n is called even iff $2 \mid n$."

⇓ **parse**



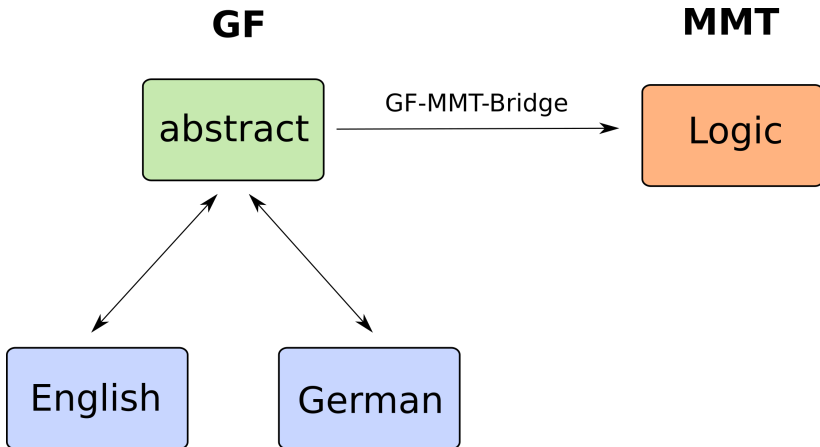
⇓ **linearize**

$(\forall n. ((\lambda x. \mathbf{int}(x))n) \Rightarrow ((\lambda x. \mathbf{even}(x))n \Leftrightarrow \mathbf{divides}(2, n)))$

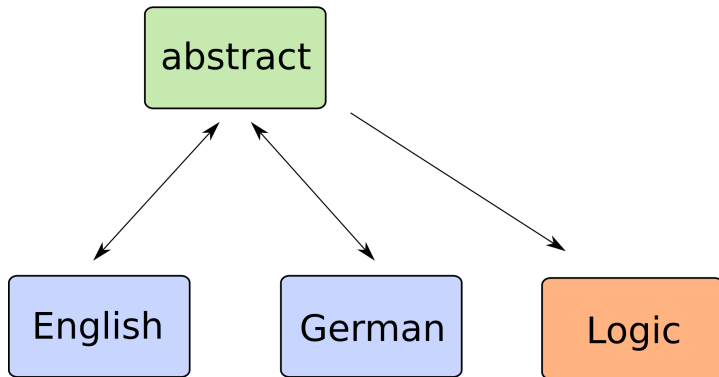
⇓ **external simplifier**

$\forall n. \mathbf{int}(n) \Rightarrow (\mathbf{even}(n) \Leftrightarrow \mathbf{divides}(2, n))$

Use an external system (MMT) for the logic:



GF



There are formulas in the text:

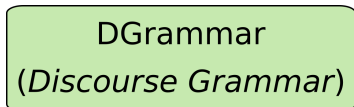
“A sequence $x = \{x_n\}_{n=1}^{\infty} \in l^{\infty}(V)$ is called quasi-almost convergent to $v \in V$ if $\forall L \in \Pi, L(x - \tilde{v}) = 0$.” [5]

There are formulas in the text:

“A sequence $x = \{x_n\}_{n=1}^\infty \in l^\infty(V)$ is called quasi-almost convergent to $v \in V$ if $\forall L \in \Pi, L(x - \tilde{v}) = 0$.” [5]

There is text in the formulas:

“ $H(P) = \{\alpha \in \mathbb{N}_0 \mid \text{there exists a rational function } f \text{ on } C \text{ with } (f)_\infty = \alpha P\}$ ” [2]

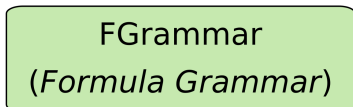


English

German

...

Depends on language



MathML

LaTeX

...

Depends on representation

There is No Standard Formula Representation

Example:

" $x^2 + 1$ is greater than or equal to $\sqrt{x^2 + 1}$."

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First Idea:

$x^2 + 1$ is greater than or equal to `SQRT(x^2 + 1)`.

There is No Standard Formula Representation

Example:

$x^2 + 1$ is greater than or equal to $\sqrt{x^2 + 1}$.

First Idea:

$x^2 + 1$ is greater than or equal to `SQRT(x^2 + 1)`.

LaTeX:

$x^2 + 1$ is greater than or equal to `\sqrt{x^2 + 1}`.

Formula: $x^2 + 1$

Presentation MathML

```
<math>
  <mrow>
    <msup>
      <mi>x</mi>
      <mn>2</mn>
    </msup>
    <mo>+</mo>
    <mn>1</mn>
  </mrow>
</math>
```

Content MathML

```
<math>
  <apply>
    <plus />
    <apply>
      <power />
      <ci>x</ci>
      <cn>2</cn>
    </apply>
    <cn>1</cn>
  </apply>
</math>
```

Formula Representations - MathML

Formula: $x^2 + 1$

Presentation MathML

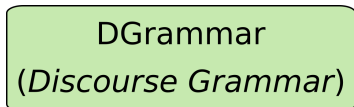
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<math>
  <mrow>
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    </apply>
    <cn>1</cn>
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</math>
```

\LaTeX $\xrightarrow{\text{LaTeXML}}$ MathML (see [Mil])

Remember: Grammar Architecture

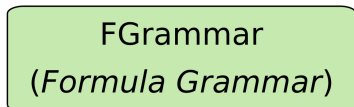


English

German

...

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LaTeX

...

Depends on representation

Definitions:

*"An integer n is called **even** iff $2|n$."*

Declarations:

"Let \tilde{H} be a numerical semigroup." [2]

Statements:

"For any graph G , $\alpha_1(G) \leq \frac{nb(G)}{4}$." [4]

Mathematical Objects:

"An *integer* n is called **even** iff $2|n$."

"Let \tilde{H} be a *numerical semigroup*." [2]

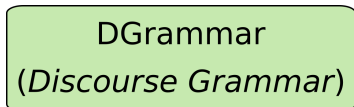
"For any *graph* G , $\alpha_1(G) \leq \frac{nb(G)}{4}$." [4]

Mathematical Properties:

"An integer n is called **even** iff $2|n$."

"If $x = \{x_n\}_{n=1}^{\infty} \in l^{\infty}(V)$ is *strongly almost convergent in V* , then [...]" [5]

Remember: Grammar Architecture

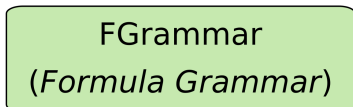


English

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...

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LaTeX

...

Depends on representation

Formula Statement:

*"An integer n is called **even** iff $2|n$."*

"Since $uv \notin A$, this implies that $uz \in A$ and $vz \in A$ " [4]

Objects:

" $\bigcup_{i \in I} O_i$ is open in Y ."

"The stabilizer in $G^{\mathbb{C}}$ for p is an algebraic group." [1]

(Restricted) Identifier:

*"An integer n is called **even** iff $2|n$."*

"Let $r \geq 2$ be an integer."

Numerals: $2, 19, \dots$

Identifiers: n, φ, G, \dots

Binary Operators: $+, \cap, \dots$

Binary Relations: \geq, \in, \dots

Example: $n^2 + 19 \geq n^2$

See also [Gin11]

Parsing a Formula - Binary Relations

Example: " $n > 1$ "

```
-- abstract grammar:  
greater_than : FExpression -> FExpression -> FStatement;  
  
-- concrete grammar:  
greater_than a b = a ++ ">" ++ b;
```

Parsing a Formula - Binary Relations

Example: " $n > 1$ "

```
-- abstract grammar:
greater_than : FExpression -> FExpression -> FStatement;

-- concrete grammar:
greater_than a b = a ++ ">" ++ b;
```

Better way:

```
-- abstract grammar:
apply_bin_rel : FBinRelation -> FExpression ->
               FExpression -> FStatement;

-- concrete grammar could be:
apply_bin_rel rel a b = a ++ rel ++ b;
```

Parsing a Formula - Binary Relations

The first solution couldn't handle the following cases nicely:

- " $1 < m < n$ "
- " $0 \leq r < 1$ "
- " $0 = t_0 < t_1 < \dots < t_n = 1$ "

Parsing a Formula - Binary Relations

The first solution couldn't handle the following cases nicely:

- “ $1 < m < n$ ”
- “ $0 \leq r < 1$ ”
- “ $0 = t_0 < t_1 < \dots < t_n = 1$ ”

Cases like “ $0 \leq r < 1$ ” are easy with better approach:

```
-- abstract grammar:
apply_tern_rel : FBinRelation -> FBinRelation ->
    FExpression -> FExpression -> FExpression ->
    FStatement;
```

```
-- concrete grammar:
apply_tern_rel rel1 rel2 a b c = a ++ rel1 ++ b ++
    rel2 ++ c;
```

Recall: Mathematical Language - Formula Level

Formula Statement:

*"An integer n is called **even** iff $2|n$."*

"Since $uv \notin A$, this implies that $uz \in A$ and $vz \in A$ " [4]

Objects:

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"The stabilizer in $G^{\mathbb{C}}$ for p is an algebraic group." [1]

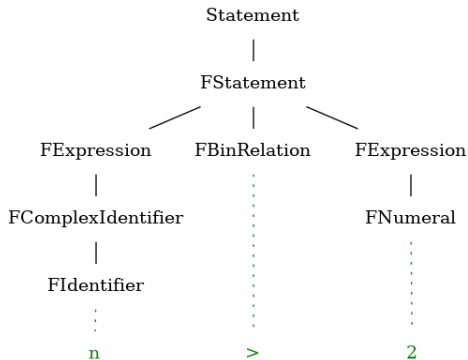
(Restricted) Identifier:

*"An integer n is called **even** iff $2|n$."*

"Let $r \geq 2$ be an integer."

Example: “ $n > 2$ ” as Statement

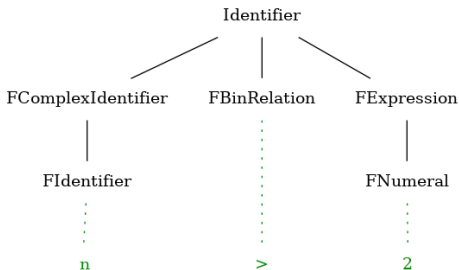
“we know that $n > 2$ ”



In logic: **greater**($n, 2$)

Example: “ $n > 2$ ” as Identifier

“there is an integer $n > 2$ such that...”



$(\exists n. (\lambda x. \mathbf{int}(x))\, n \wedge \mathbf{greater}(n, 2) \wedge (\dots))$

\Downarrow external simplifier

$\exists n. \mathbf{int}(n) \wedge \mathbf{greater}(n, 2) \wedge \dots$

Example: “ $n > 2$ ” as Identifier

We need to extract “ n ” from “ $n > 2$ ”:

```
-- Identifier record (simplified)  
Identifier = {  
    formula : Str;    -- the restriction, e.g. greater(n, 2)  
    core   : Str;    -- the identifier, e.g. n  
};
```


Example: “ $n > 2$ ” as Identifier

We need to extract “ n ” from “ $n > 2$ ”:

```
-- Identifier record (simplified)
Identifier = {
    formula : Str;  -- the restriction, e.g. greater(n, 2)
    core    : Str;  -- the identifier, e.g. n
};
```

```
-- example usage
fcid_fbinrel_fexpr_to_identifier a r1 b = {
    formula = r1 ++ "(" ++ a ++ "," ++ b ++ ")";
    core    = a;
};
```

```
-- for statements like  $(\exists n. (\lambda x. \text{int}(x)) n \wedge \text{greater}(n, 2))$ 
exists_statement obj id = inp("∃" ++ id.core ++ "."
    ++ lwrap(obj) ++ id.core ++ and_formula(id));
```

Examples:

- “*integer*”
- “*an even integer*”
- “*There is a bijective map from $(0, 1)$ to \mathbb{R}* ”
- “*There is a bijective map f from $(0, 1)$ to \mathbb{R}* ”
- “*Let C be a complete nonsingular irreducible curve over an algebraically closed field k of characteristic 0*” [2]

```
exists_suchthat :  
  PosNegPol          -- is/isn't  
  -> MObj            -- integer  
  -> Identifier      -- n  
  -> StatementFin    -- ...  
  -> StatementFin;
```

*“there is an **integer** n such that ...”*

$\exists n.\text{int}(n) \wedge \dots$

```
exists_suchthat :  
  PosNegPol          -- is/isn't  
  -> MObj            -- positive even integer  
  -> Identifier      -- n  
  -> StatementFin    -- ...  
  -> StatementFin;
```

“there is a *positive even integer* n such that ...”

$\exists n. \text{pos}(n) \wedge \text{even}(n) \wedge \text{int}(n) \wedge \dots$

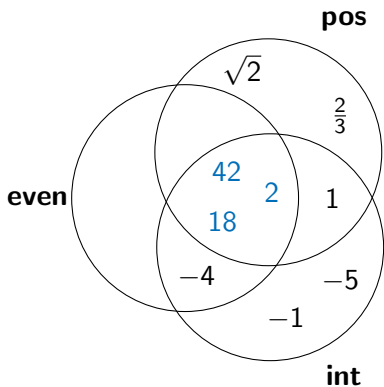
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  -> Identifier       -- n
  -> StatementFin    -- ...
  -> StatementFin;
```

“there is a *positive even integer* n such that ...”

$\exists n. \text{pos}(n) \wedge \text{even}(n) \wedge \text{int}(n) \wedge \dots$

$\exists n. (\lambda x. \text{pos}(x) \wedge \text{even}(x) \wedge \text{int}(x))n \wedge \dots$

Intersective Interpretation of Adjectives



- “*Positive even integers*” are the intersection of integers, even things and positive things
- This doesn't work for every adjective!

“An integer n is called even iff $2 \mid n$.”

Idea: **even**(n) \Leftrightarrow **divides**(2, n)

“An integer n is called even iff $2|n$.”

Idea: **even**(n) \Leftrightarrow **divides**(2, n)

With quantifier: $\forall n. \mathbf{int}(n) \Rightarrow (\mathbf{even}(n) \Leftrightarrow \mathbf{divides}(2, n))$

What's generated:

$(\forall n. ((\lambda x. \mathbf{int}(x))n) \Rightarrow ((\lambda x. \mathbf{even}(x))n \Leftrightarrow \mathbf{divides}(2, n)))$

“A positive integer n is called prime, iff there is no integer $1 < m < n$ such that $m|n$ ”

Translation to (from) German:

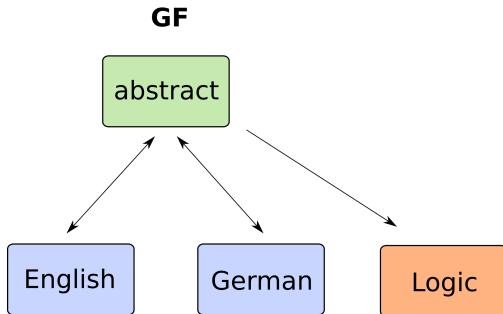
“Eine positive ganze Zahl n ist prim genau dann, wenn es keine ganze Zahl $1 < m < n$ gibt, sodass $m|n$ ”

Formalization:

$$(\forall n.((\lambda x.\mathbf{pos}(x) \wedge \mathbf{int}(x))n) \Rightarrow ((\lambda x.\mathbf{prime}(x))n \Leftrightarrow (\neg \exists m.(\lambda x.\mathbf{int}(x))m \wedge \mathbf{less}(1, m) \wedge \mathbf{less}(m, n) \wedge (\mathbf{divides}(m, n))))))$$

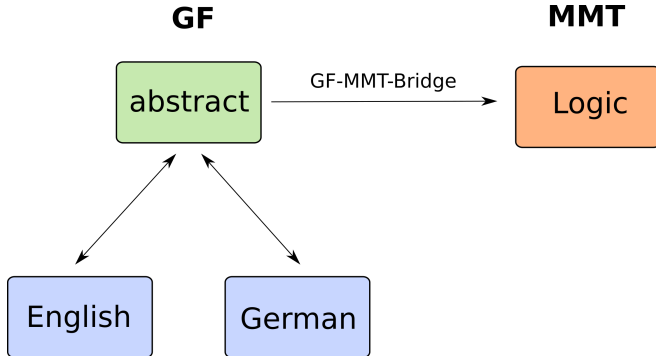
\Downarrow external simplifier

$$\forall n.\mathbf{pos}(n) \wedge \mathbf{int}(n) \Rightarrow (\mathbf{prime}(n) \Leftrightarrow \neg \exists m.\mathbf{int}(m) \wedge \mathbf{divides}(m, n) \wedge \mathbf{less}(1, m) \wedge \mathbf{less}(m, n))$$

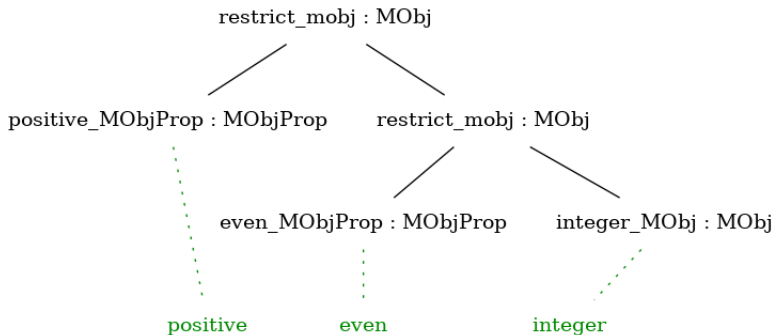


- + Parsing and logic generation in one tool (GF)
- – Grammar engineering gets complicated
- – We need an external tool for simplification and reasoning

Second Approach: Semantics Modelling in MMT



- *Meta Meta Tool*
- Foundation-independent
- A lot of features for mathematical knowledge management
- See e.g. [Rab16]
- We'll focus only on a small “slice” of MMT


$$\lambda x. \mathbf{pos}(x) \wedge \mathbf{even}(x) \wedge \mathbf{int}(x)$$

$\lambda x. \mathbf{pos}(x) \wedge \mathbf{even}(x) \wedge \mathbf{int}(x)$

Type declarations for atoms:

even_MObjProp : $\iota \rightarrow o$ |
positive_MObjProp : $\iota \rightarrow o$ |
integer_MObj : $\iota \rightarrow o$ |

$$\lambda x. \mathbf{pos}(x) \wedge \mathbf{even}(x) \wedge \mathbf{int}(x)$$

Type declarations for atoms:

```

even_MObjProp :  $\iota \rightarrow o$  |
positive_MObjProp :  $\iota \rightarrow o$  |
integer_MObj :  $\iota \rightarrow o$  |

```

Better: Types for **cats** in MMT:

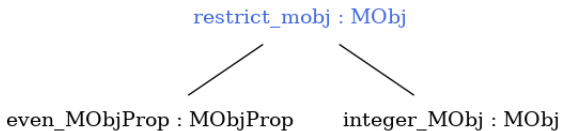
```

MObj : type | =  $\iota \rightarrow o$  |
MObjProp : type | =  $\iota \rightarrow o$  |

even_MObjProp : MObjProp |
positive_MObjProp : MObjProp |
integer_MObj : MObj |

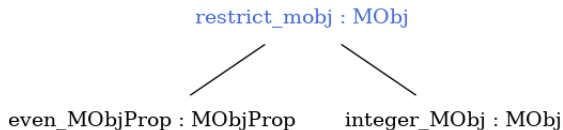
```

Grammar Nodes: **restrict_mobj**



Goal: **restrict even integer** = $\lambda x.\text{even}(x) \wedge \text{integer}(x)$

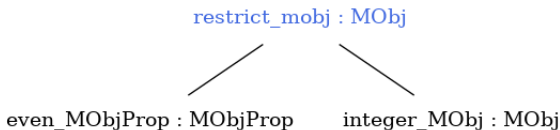
Grammar Nodes: **restrict_mobj**



Goal: **restrict even integer** = $\lambda x. \text{even}(x) \wedge \text{integer}(x)$

$\text{restrict_MObj} : \text{MObjProp} \rightarrow \text{MObj} \rightarrow \text{MObj} \mid$
 $= [\text{mprop}, \text{mobj}] [x] \text{mprop}(x) \wedge \text{mobj}(x) \mid$

Grammar Nodes: `restrict_mobj`



Goal: **restrict even integer** = $\lambda x. \text{even}(x) \wedge \text{integer}(x)$

$$\begin{array}{l} \text{restrict_MObj} : \text{MObjProp} \rightarrow \text{MObj} \rightarrow \text{MObj} \mid \\ = [\text{mprop}, \text{mobj}] [\text{x}] \text{mprop}(x) \wedge \text{mobj}(x) \mid \end{array}$$

We can map the GF tree to an MMT term:

restrict_mobj even_MObjProp integer_MObj

\Downarrow GF-MMT-Bridge

restrict_MObj even_MObjProp integer_MObj

```
abstract Cats = {
  cat
  MObj;
  MObjProp;
}
```

```
abstract Lexicon = Cats ** {
  fun
    even_MObjProp : MObjProp;
    positive_MObjProp : MObjProp;
    integer_MObj : MObj;
}
```

```
abstract Grammar = Cats ** {
  fun
    restrict_MObj :
      MObjProp -> MObj ->
      MObj;
}
```

```
theory Cats : ur:?LF =
  include ?FOL |
```

```
MObj : type | =  $\iota \rightarrow o$  |
MObjProp : type | =  $\iota \rightarrow o$  |
```

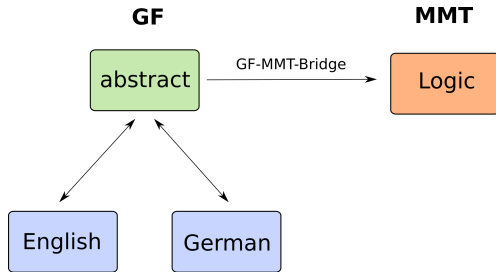
```
theory Lexicon : ur:?LF =
  include ?Cats |
```

```
even_MObjProp : MObjProp |
positive_MObjProp : MObjProp |
integer_MObj : MObj |
```

```
theory Grammar : ur:?LF =
  include ?Cats |
```

```
restrict_MObj
  : MObjProp  $\rightarrow$  MObj  $\rightarrow$  MObj |
  = [mprop,mobj] [x]
    (mprop x)  $\wedge$  (mobj x) |
```

Framework for Language Semantics Experiments



GF	(= <i>grammar</i> development framework)
+ MMT	(= <i>logic</i> development framework)
<hr/>	
???	(= <i>semantics</i> development framework)

```
theory Cats : ur:?LF =  
  include ?FOL |  
  
  MObj : type | =  $\iota \rightarrow o$  |  
  MObjProp : type | =  $\iota \rightarrow o$  |
```

→ Where does FOL come from?

```
theory Cats : ur:?LF =  
  include ?FOL |  
  
  MObj : type | =  $\iota \rightarrow o$  |  
  MObjProp : type | =  $\iota \rightarrow o$  |
```

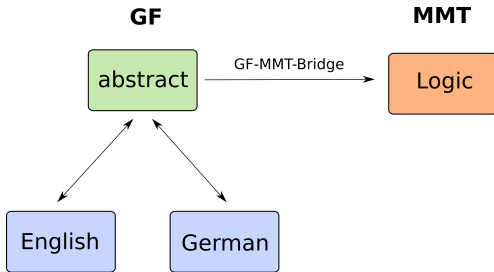
→ Where does FOL come from?

```
theory FOL : ur:?LF =  
  include ?PL |  
  // type for individuals |  
  ind : type | #  $\iota$  |  
  
  // add quantifiers |  
  forall : (  $\iota \rightarrow o$  )  $\rightarrow o$  | #  $\forall 1$  |  
  exists : (  $\iota \rightarrow o$  )  $\rightarrow o$  | #  $\exists 1$  | =  $[p] \neg \forall [x] \neg (p\ x)$  |
```

Defining a Logic in MMT

```
theory PL : ur:?LF =  
  // declare a type for propositions and introduce o as notation |  
  prop : type | # o |  
  
  // declare basic logical operations |  
  negation : o  $\rightarrow$  o | #  $\neg$  1 prec 30 |  
  conjunction : o  $\rightarrow$  o  $\rightarrow$  o | # 1  $\wedge$  2 prec 15 |  
  
  // we can define other operations through  $\neg$  and  $\wedge$  |  
  disjunction : o  $\rightarrow$  o  $\rightarrow$  o | = [a,b]  $\neg$  ( $\neg$  a  $\wedge$   $\neg$  b) | # 1  $\vee$  2 prec 10 |  
  implication : o  $\rightarrow$  o  $\rightarrow$  o | = [a,b]  $\neg$  a  $\vee$  b | # 1  $\Rightarrow$  2 prec 8 |  
  equivalence : o  $\rightarrow$  o  $\rightarrow$  o | = [a,b] (a  $\Rightarrow$  b)  $\wedge$  (b  $\Rightarrow$  a) | # 1  $\Leftrightarrow$  2 prec 5 |
```

Framework for Language Semantics Experiments



GF	(= <i>grammar</i> development framework)
+ MMT	(= <i>logic</i> development framework)
<hr/>	
???	(= <i>semantics</i> development framework)

Very hard!!

See also [Zin04] and [Wol13].

"From $A \subset B$ and $B \subset A$ it follows that $A = B$."

" \subset " might refer to " \subseteq " or to " \subsetneq "

→ we get at least $2 \cdot 2 = 4$ parse trees

→ we can discard some of them:

Example: Interpreting both " \subset " as " \subsetneq ":

$$(\subseteq (A, B) \wedge A \neq B) \wedge (\subseteq (B, A) \wedge A \neq B), \quad A = B$$

“an integer n is called even iff $2|n$ ”

even : int \rightarrow o | = [n] div(2, n) |

- Math Linguistics/Translation
- Semantics Development Framework:

$$\begin{array}{rcl} \text{GF} & (= \textit{grammar development framework}) & \\ + \text{MMT} & (= \textit{logic development framework}) & \\ \hline \text{???} & (= \textit{semantics development framework}) & \end{array}$$

- Math Linguistics/Translation
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$$\begin{array}{rcl} \text{GF} & (= \textit{grammar development framework}) & \\ + \text{MMT} & (= \textit{logic development framework}) & \\ \hline \text{???} & (= \textit{semantics development framework}) & \end{array}$$

Advertisement: SIGMathLing

Special Interest Group on Maths Linguistics

<https://sigmathling.kwarc.info/>

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- *GloVe* word embeddings for mathematics
- ...

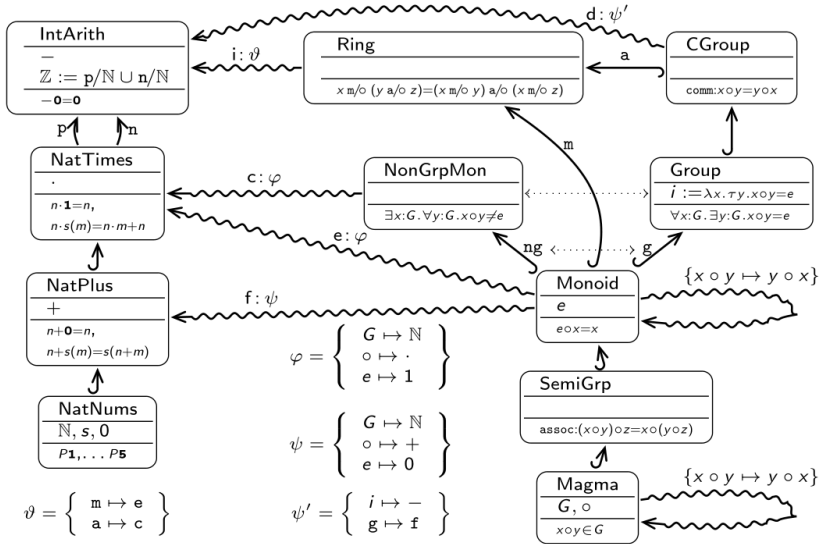
```

theory PLSemantics : ur:?LF =
  include ?PLSyntax |

  ded : o  $\rightarrow$  type | #  $\vdash 1$  | //jder notjvdash |

  trueIn :  $\vdash T$  |
  andIn : {A,B}  $\vdash A \rightarrow \vdash B \rightarrow \vdash A \wedge B$  | # andI 3 4 |
  negEl : {A}  $\vdash A \rightarrow \vdash \neg A \rightarrow \vdash \perp$  | # negE 2 3 |
  falseEl : {A}  $\vdash \perp \rightarrow \vdash A$  | # falseE 2 |
  andEl : {A,B}  $\vdash A \wedge B \rightarrow \vdash A$  | # andEL 3 |
  
```

Bonus: Modular Math in MMT





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