

# FLE Preliminary Results

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## Support

- Kenneth Beesley
- Lionel Clement
- Thomas Hanneforth
- Ronald Kaplan
- Gerald Penn
- Richard Sproat
- Annie Zaenen
- ...

# Support

Provided morphologies and grammars to test:

- Mary Dalrymple
- Helge Dyvik and Paul Meurer
- Agnieszka Patujek and Adam Przepiórkowski

Morally supported and brought up the idea of the Monotonicity Calculus integrated in an LFG and/or CCG type of parser: Larry Moss

Local IU community: Sandra Kübler, Markus Dickinson

The BNFC-team fixed several compiler issues for our code generation.

# Motivation

- Need for a *modern* grammar engineering platform
- Platform independent (e.g. Linux, OSX, Windows, Chrome OS, Android, iOS)
- Parallelizable and distributed architecture
- Interoperable
  - Tied to common scripting and web languages like Python, JavaScript.
  - Import and export standards/exchange formats using XML, JSON, etc.
- Open License (e.g. **Apache License 2.0**, MIT License)

# Motivation

## Purpose

- Computational Language Documentation
- Research and Education
- Productive development of applications
- Platform for hybrid white- and black-box modeling:
  - Grammar engineering combined with machine learning algorithms for probabilistic models or (grammar) induction.

# Infrastructure

- Two Bitbucket Git repositories:
  - Private repo for experimenting, tutorials, data, etc.
    - Access via email and contact (write me!)
  - Open repository
    - <https://bitbucket.org/dcavar/fle/>
    - Not much there yet

# Infrastructure

- Coding in [C++11](#) and newer using
  - [GCC/G++](#), [Clang/LLVM](#), Xcode, Cygwin, [MS VisualStudio](#).
  - [CMake](#)-based compiler configuration.
- [BNFC](#)-based grammar to code conversion (using [flex](#) and [bison](#)).
- [Doxygen](#)-based code documentation.
- Git-based code and version management (using [Bitbucket](#)).
- [CLion](#) IDE.
- OS: Linux, Mac, Windows

# Code and Dependencies

- Required libraries (so far):
  - C++ Standard Library
  - [Boost Libraries](#)
  - [Foma](#)
- In the final version also:
  - [OpenFST](#)
  - [OpenGrm Thrax Grammar Development Tool](#)



# Code and Interoperability

- The following libraries will be optionally linked:
  - [Ucto](#) – Unicode rule-based tokenizer
  - Alternative FST-libraries (e.g. HFST)
  
- Required and optional libraries are available and/or made available on the main desktop operating systems (all are C or C++ based).

# Goals

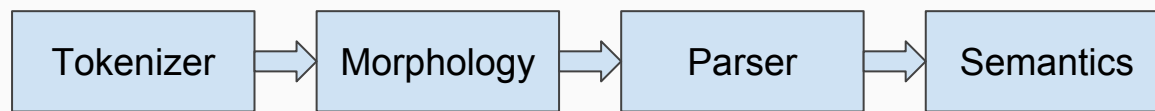
- Library of services rather than monolithic parser or toolset:
  - Parsing CFG, PCFG, CCG and related formalisms
  - Parsing XLE compatible grammars
  - Utilizing XFST-compatible morphologies (using e.g. Foma)
    - Conversion of XFST-morphology outputs to various formats
  - Tokenizers using Foma-based FSTs, rule-based tokenizers for Ucto, simple regular expression based tokenizers
  - Parsing-algorithms that use the different formalisms above

# Goals

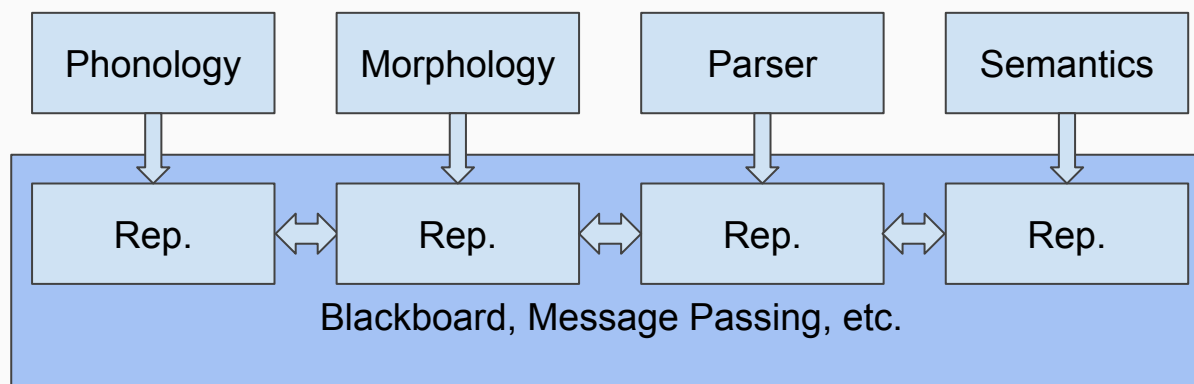
- Library of services:
  - Relating to Dependency Grammars (mapping from c- and f-structures)
  - Integration of training and machine learning algorithms: probabilistic grammar backbone, morphologies, c- and f-structure relations
  - Available for C++-code base and as modules to common scripting languages

# Application

Classical pipeline architecture:



Parallel architecture with mapping constraints (Jackendoff, 1997, 2007):



# Current implementation: Tokenization

- Simple space-based (regular expressions, Boost)
- Foma-based (e.g. for Burmese and related languages)
- Ucto-based possible, not tested yet

# Current implementation: Morphology

- Foma-based (e.g. for English, Croatian, Burmese, Mandarin)
  - Processing of approx. 200,000 ambiguous tokens per second within the parser integration (using 3rd gen. Intel i7 laptop CPU on a single thread/core)
- Potentially also:
  - Interface to simpler Part-of-Speech taggers.

# Current implementation: Syntactic Parsing

- Simple Earley-type of Parser using hash-tables for rules and edges
  - *Prediction, Scanning, Completion*
  - Edges as indexed dotted rules on a chart/stack
  - Unification over trees with root or goal symbol
- Weighted Finite State Transducer (WFST) as grammar representation

# Toy Rules

TOY ENGLISH RULES (1.0)

```
S --> e: (^ TENSE);
      (NP: (^ XCOMP* {OBJ|OBJ2})=!
          (^ TOPIC)=!)
      NP: (^ SUBJ)=!
          (! CASE)=NOM;
      { VP
        |VPaux}.
```

```
VP --> V
      (NP: (^ OBJ)=!
          (! CASE)=ACC)
      PP*:! $ (^ ADJUNCT).
```

```
VPaux --> AUX
         VP.
```

```
NP --> (D)
      N
      PP*:! $ (^ ADJUNCT).
```

```
PP --> P
      NP: (^ OBJ)=!
          (! CASE)=ACC.
```

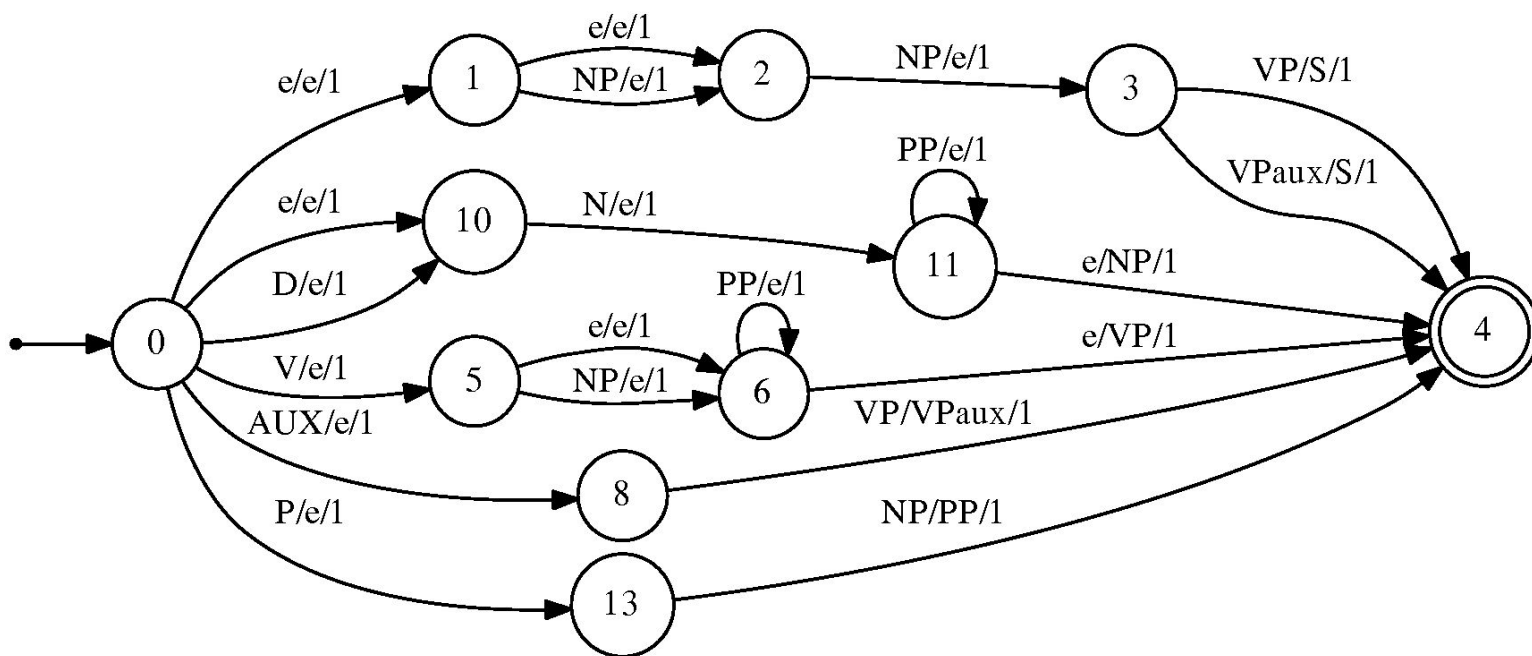


# Grammar Backbone as a WFST

$T$  as a 7-tuple  $(Q, \Sigma, \Gamma, I, F, \lambda, \varrho)$  with

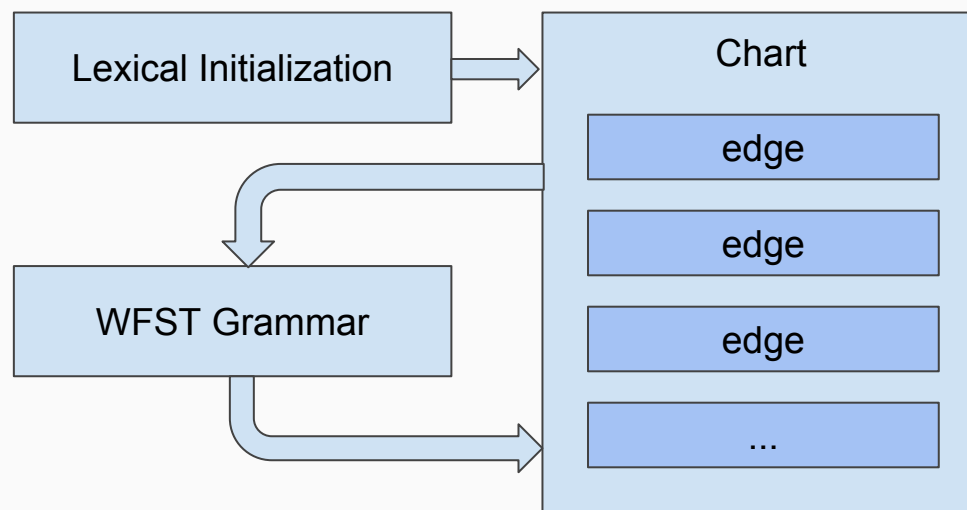
- $Q$  a finite set of states
- $\Sigma$  a finite set over the input alphabet
- $\Gamma$  a finite set over the output alphabet
- $I$  a subset of  $Q$  of initial states (only one in our case)
- $F$  a subset of  $Q$  of final states
- $E \subseteq Q \times (\Sigma \cup \{\varepsilon\}) \times (\Gamma \cup \{\varepsilon\}) \times Q \times K$ , a mapping of a state  $\in Q$  and an input symbol  $\in \Sigma \cup \{\varepsilon\}$  to an output symbol  $\in \Gamma \cup \{\varepsilon\}$  and a new state  $\in Q$ ; and  $\lambda : I \rightarrow K$  mapping initial states and  $\varrho : F \rightarrow K$  final states to weights.

# Grammar Backbone as a WFST



# WSFT Backbone

Similar to Earley algorithm:



# WSFT Backbone

## Implementation:

- Edges are integer tuples, i.e. indexes over input token vectors and states in the WFST.
- WFST own class with simple optimization.
- Slower than simple Earley-type of implementation.

## Weights:

- Probabilities of rules as in PCFGs.
- Transitions of symbols as in Markov Chains
- Unification and AVMS
- A combination of all the above

# WFST Extensions

- Export of DOT specification (and indirectly SVG, PDF, etc.).
- Binary dump of WFST for faster load cycles.
  
- Reimplementation of WFST based on OpenFST with the benefits of the rich set of library functions.
- Extension with OpenGrm, i.e. an OpenFST-based implementation of a single- and double-stack pushdown automaton.

# Restricted Backbone as WFST

## Potentially:

- Limited recursion depth for center embeddings, and
- Mapping of CFG backbone to a WFST with all possible word order regularities.
- Generation of a very efficient parser with certain limitations of the backbone complexity.

# WFST Backbone and Parser

Current grammar formalisms defined in LBNF and converted with BNFC to C++ parsers:

- CFG
- PCFG
- XLE
  - CONFIG (complete)
  - FEATURES (incomplete)
  - LEXICON (incomplete)
  - MORPHOLOGY (incomplete)
  - TEMPLATES (missing)
  - RULES (no: edit rules, METARULEMACRO, ...)

# LBNF and Formalisms

```
comment "\"" "\" ;
Grammar.    GRAMMAR ::= [RULE] ;

RuleS.      RULE ::= WORD [LEXDEF] ;
RuleSDisjunction. RULE ::= WORD "{" [DLEXDEF] "}" ;
RuleUnknown.  RULE ::= "-unknown" [LEXDEF] ;
RuleToken.   RULE ::= "-token" [LEXDEF] ;
RuleSEditEntry.  RULE ::= WORD [EDITENTRY] ;
RuleUnknownEditEntry. RULE ::= "-unknown" [EDITENTRY] ;
RuleTokenEditEntry.  RULE ::= "-token" [EDITENTRY] ;
terminator RULE "." ;
Definition.  LEXDEF ::= CAT MORPHCODE [DSHEMA] ;
DefinitionSimple. LEXDEF ::= Label ;
separator   LEXDEF ";" ;
DefinitionDisjunct. DLEXDEF ::= LEXDEF ;
separator DLEXDEF "|" ;
...
```



# BNFC Output

```
void Skeleton::visitGrammar(Grammar *grammar) {
    /* Code For Grammar Goes Here */
    grammar->listrule_->accept(this);
}

void Skeleton::visitRuleS(RuleS *rules) {
    /* Code For RuleS Goes Here */
    rules->word_->accept(this);
    rules->listlexdef_->accept(this);
}

void Skeleton::visitRuleSDisjunction(RuleSDisjunction *rulesdisjunction) {
    /* Code For RuleSDisjunction Goes Here */
    rulesdisjunction->word_->accept(this);
    rulesdisjunction->listdlexdef_->accept(this);
}
```

# LBNF and Formalisms

## BNFC

- Haskell-based BNF Converter to flex and bison code.
- Compilation using C++ compiler (if conversion to C++).
- Generates LaTeX documentation of parser definition.
- Generates test-binaries for testing formalism/language parser.
- Generates a parser class using the visitor-architecture.

# Current implementation: Unification

- Basic algorithm using Directed Acyclic Graphs (DAG)
- No advanced algorithms yet, e.g. Disjunction, Constraints, Negation
- No performance tests
- Considerations:
  - Optimization using mapping of AVMs to bit-vectors for unification
  - Caching of operations and results
  - Unification over resulting c-structures or during transitions using WFSTs

# TODOs

- **Windows**

- So far using Cygwin, preparing to use native DLLs:
  - We need a setup to generate Boost, Foma, OpenFST, OpenGrm as DLLs
  - Adaptation of the CMake code

- **Mac OS X**

- Similar library-requirements as Windows, but much easier to compile native linking libraries (using Clang and the LLVM compiler environment that comes with XCode)

# TODOs

- **Compiling libraries**

- Separation of an application specification and environment from core functionalities that could be defined in libraries only.
- Definition of a Python 3.x extension module, i.e. the Grammar engineering environment could be written in Python and Qt or JavaScript and NodeJS for example.

# TODOs

## **XLE-formalism**

- Finalize all grammar section parsers with coverage for all sample grammars that we have.

## **Parser algorithm**

- Finalize the two different parsing with unification during edge formation or after parse tree generation for complete parse trees only and evaluate behavior and performance.

And a lot more...

# Related activities as part of FLE

## **Morphologies:**

- English
- Croatian (port of old CroMo with Ragel-based rule compiler)
- Burmese (and related languages)
- Mandarin
- and integration of other freely available morphologies