#### **CONTENTS**

```
1 INTRODUCTION
       An alternative user interface
   1.1
       Problem description
       A proposed solution
   1.4 Grammatical Framework
       1.4.1 A simple example
   1.5
       GF resource grammar library
              Example usage of RGL in a grammar
                                                     7
       1.5.2 Generalizing the concrete syntax
  APPLICATION DEVELOPMENT
       Requirements specification
              Generation of mock data
       2.1.1
                                         12
              Grammar development
       2.1.2
                                        12
              Suggestions
       2.1.3
              Runtime environment
       2.1.4
                                       13
   2.2 Grammar development
       2.2.1
              Supported instructions
                                       14
       2.2.2
              Names
                         14
              More instructions
       2.2.3
       2.2.4 Extending the grammar
                                        16
   2.3 Boolean operators
  2.4 Suggestion engine
                            22
       2.4.1 Populating the Solr index
                                          23
   2.5 Generation of mock data
  RESULTS
               29
3
  DISCUSSION
                   30
       Contributions
                        30
       To dos
   4.2
   4.3 Negative things
                          30
A GF RUNTIME SYSTEMS AND LIBRARIES
                                             31
       GF runtime systems
       A.1.1 Portable Grammar Format
                                          31
       A.1.2 GF libraries
                             31
              Building and installing the C to Java wrapper library
       A.1.3
                                                                  32
              Using the Java-runtime
       A.1.4
  IMPLEMENTATION DETAILS
                                  34
       Mock data generation
   B.1
                                34
   B.2
       Web application
```

BIBLIOGRAPHY 36

INTRODUCTION

#### 1.1 AN ALTERNATIVE USER INTERFACE

In this thesis we will investigate how we can create a user interface which allows us to execute queries in a query language by expressing instructions in natural language. In other terms, we want to translate from a natural language into a query language. A query language is a computer language which is used to query a database or index. A natural language is a language that humans use to communicate with each other.

#### 1.2 PROBLEM DESCRIPTION

How can one retrieve information from a computer by writing instructions in a natural language? The inspiration for this thesis came from Facebook graph search<sup>1</sup>, which is a service that allows users to search for entities by asking the server for information in a natural language.

In this project, we have chosen examine how a similar service can be realized. We have limited the project to handle instructions that can occur naturally in the intranet of a software development company. We assume that there exists an intranet which consists of a database with information about employees, customers and projects. A typical instruction in this environment could be

people who know Java

The answer would be a list of all employees in the database who have some degree of expertise of the programming language Java. However, when using search engines, expert users do not use instructions as the one above. The simply rely purely on keywords[1]. The following instruction is more suited for expert users

people know java

How can we create a user interface that is sufficient for both regular- and expert users? And how can we translate these instructions into machine readable queries?

<sup>1</sup> https://www.facebook.com/about/graphsearch

## 1.3 A PROPOSED SOLUTION

Query languages require precise syntax, we therefore need precise translation from a natural language into a query language. Since we have a limited scope of instructions, we know all instructions that the program shall support and we know how their machine readable representation shall look like. We only need a tool which we can use to make the mapping between natural language into query language. A very flexible tool we can use to accomplish this is a multilingual grammar.

A grammar is a set of structural rules which decide how words can can be created and be combined into clauses and phrases. By expressing how words can be combined into an instruction in one language one can also use the same logic to express how the same instruction can be produced in another language. A *multilingual* grammar is a special type of grammar which can translate between two or more languages.

Grammars has been used since the 1950's in the field of computer science [2, p. 4], and they have played a main role in the development of compilers where they are used to translate source code into machine readable instructions.

#### 1.4 GRAMMATICAL FRAMEWORK

Grammatical Framework (GF) is an open source functional programming language for creating grammars for natural languages.[2, p. 1] GF features a strong type system, separate abstract and concrete syntax rules and reusable libraries to facilitate design of grammars. For a reader with a background within compilers, one can see that GF is very much based on the theory of programming languages as they also make use of abstract- and concrete syntaxes[3, pp. 69-70].

Abstract syntax is a tree representation which captures the *meaning* of a sentence, and leaves out anything irrelevant. The concrete syntax represents a natural language. It describes how an abstract syntax tree is represented as a string in the natural language.

With both abstract and concrete syntaxes, GF is able to create a *parser* and a *linearizer* for all given concrete languages. The parser translates strings into abstract syntax and the linearizer translates abstract syntax trees into string representations for a specified concrete syntax. In addition, GF can also derive a *generator* for the abstract syntax. The generator can create all possible abstract syntax trees.

Because GF separates abstract and concrete syntax, one can easily add a new concrete syntax (a natural language) to an existing abstract syntax. This advantage also makes it easy to translate between many languages.

## 1.4.1 *A simple example*

The following section presents an example of how GF can be used to create a grammar that can generate and translate the sentence *which people know Java?* into Apache Solr query language and vice verca. Apache Solr is a search platform based on Apache Lucene. We will explain more about Solr query language later in the thesis.

## Abstract syntax

To model the meaning of sentences, GF adopts the use of functions and *cate-gories*. A category (cat) in GF is the same as a data type. We start by listing the categories we need. We then define how our data types can take on values. This is achieved by using functions. The functions in an abstract syntax are not implemented, we can therefore only see the function declarations. The purpose for this is to allow the concrete syntaxes to choose how to represent the semantics. Two concrete syntaxes can therefore implement the same semantics differently.

In Figure 1, we define a function Java: Object which means that Java is a constant and returns a value of type Object. Know takes one argument of the type Object and returns a value of type Relation.

An instruction can be created by obtaining a value of the type Instruction. Only MkInstruction returns the desired type and it takes two arguments, one of type Subject the other of type Relation.

A function without arguments is called a constant in lazy functional programming languages.

```
abstract Instrucs = {
flags startcat = Instruction;
   cat
3
     Instruction ; -- An Instruction
4
    Subject; -- The subject of an instruction
5
6
     Relation ; -- A verb phrase
     Object; -- an object
7
8
MkInstruction : Subject -> Relation -> Instruction ;
    People : Subject ;
11
    Know : Object -> Relation ;
12
     Java : Object ;
13
14 }
```

Figure 1: Abstract syntax

We can now use this abstract syntax to create an abstract syntax tree as seen in Figure 2

```
MkInstruction People (Know Java)
```

Figure 2: Abstract syntax tree

## Concrete syntax

We are now going to implement the function declarations we just defined in the abstract syntax. This implementation makes it possible to linearize abstract syntax trees into concrete syntax. We will start by defining the concrete syntax for English.

## English concrete syntax

Figure 3 shows the implementation of the concrete syntax for English. Categories are linearized by the keyword lincat, which literally means the linearization of categories. A category is linearized by assigning a data type to it. Here we assign all categories to be strings. The functions are linearized by using the keyword lin. We linearize Java by returning the string "Java", as it is a constant function. Analogously, "people" is returned by People. The function Know takes one parameter. This parameter is appended on the string "know". Finally, MkInstruction takes two arguments, where subject is prepended and relation is appended on "who". One can easily see how these functions can be used to construct the sentence *people who know Java*.

```
1 concrete InstrucsEng of Instrucs = {
2 lincat
    Instruction = Str ;
3
    Subject = Str;
    Relation = Str ;
    Object = Str;
6
  lin
    MkInstruction subject relation = subject ++ "who" ++ relation;
8
    People = "people" ;
9
    Know object = "know" ++ object ;
10
11
     Java = "Java" ;
12 }
```

Figure 3: English concrete syntax

## Solr concrete syntax

The final step in this example is to linearize abstract syntax into Solr concrete syntax. As Figure 4 shows, the categories are strings as in English. The function linearizations are however different. People returns "object\_type: Person", we assume that the Solr-schema has a field with the name object\_type which

represents which type a document is. Similarly, we make another assumption about Know. MkInstruction is also implemented differently, here we can see that the result is going to be a query string<sup>2</sup> by looking at the first part "q=" which is prepended on the subject. We then append "AND" together with relation in order to create a valid Solr query.

```
concrete InstrucsSolr of Instrucs = {
    lincat
      Instruction = Str ;
3
      Subject = Str ;
4
      Relation = Str ;
5
      Object = Str ;
6
7
8
       MkInstruction subject relation = "q=" ++ subject ++ "AND" ++ relation ;
9
       People = "object_type : Person" ;
10
       Know object = "expertise : " ++ object ;
11
      Java = "Java" ;
12
13 }
```

Figure 4: Solr concrete syntax

#### **Translation**

In order to make any translations, we need to use the GF runtime system. The runtime system we will use in this section is the shell application, which allows us to load our GF source code and use parsers, linearizers and generators. In addition to the shell application, there also exists programming libraries for GF in C, Haskell, Java and Python. These libraries can be used to build a translation application which not requires the user to have GF installed.

<sup>2</sup> http://en.wikipedia.org/wiki/Query\_string

Figure 5: GF shell prompt

A string can be parsed into an abstract syntax tree.

```
Instrucs> parse -lang=InstrucsEng "people who know Java"
MkInstruction People (Know Java)
```

Figure 6: Parse a string

Abstract syntax trees can be linearized into concrete syntaxes, here we linearize one abstact syntax tree into all known concrete syntaxes.

```
Instrucs> linearize MkInstruction People (Know Java)
people who know Java
q= object_type : Person AND expertise : Java
```

Figure 7: Linearize an abstract syntax tree

Finally, a string can be translated from one concrete syntax into another. Here we translate from InstrucsEng into InstrucsSolr. We use a *pipeline*<sup>3</sup> to pass the result of the parsing as an argument to the linearizing function.

```
3 http://en.wikipedia.org/wiki/Pipeline_(Unix)
```

Note how we use p instead of parse and l instead of linearize. They are just shorthands of their longer representations.

```
Instrucs> p -lang=InstrucsEng "people who know Java" | l -lang=InstrucsSolr
q= object_type : Person AND expertise : Java
```

Figure 8: Translate between concrete syntaxes

#### 1.5 GF RESOURCE GRAMMAR LIBRARY

The previous example is fairly easy to understand, but it is also very small. As a grammar grows to support translation of more sentences, the complexity grows as well. GF has the power to make distinctions between singular and plural forms, genders, tenses and anteriors. However, in order to correctly develop a grammar to translate these sentences one needs to have knowledge of linguistics. It is also very time consuming to implement basic morphologies over and over again. Instead, one can use GF Resource Grammar Library (RGL)[4]. The RGL contains at the time of writing grammars for 29 natural languages. These grammars includes categories and functions which can be used to represent all kinds of different words and sentences. A developer needs therefore only knowledge of her *domain* and do not need to worry about linguistic problems. By domain, we mean specific words which may have special grammatical rules, e.g. fish in English which is the same in singular as in plural form.

#### 1.5.1 Example usage of RGL in a grammar

In this section, we will present how the previous concrete syntax for English can be implemented by using the RGL. We will also show how this grammar can be further generalized into an incomplete concete syntax which can be used by both English and Swedish.

Figure 9 shows the concrete syntax for English by using the RGL. Instead of just concatenating strings, we now use functions to create specific type of words and sentences. The categories are now set to be built in types that exists in the RGL and the functions are now using the RGL in order to create values of the correct types.

The most simple function in this case is People, which shall return a noun (N). A noun can be created by using the *operation* mkN. We create a noun which has the singular form "person" and plural form "people", we will never use the singular form in this grammar, but it will become handy later in the thesis to use both singular and plural forms.

Java creates a noun similarly, except that it only gives mkN one argument. By doing this, GF applies an algorithm in order to find the plural form automatically. This does however only work on regular nouns. We then create a noun

An operation in GF is a function which can be called by linearization functions.

phrase (NP) from the noun received. Know returns a relative sentence (RS). A relative sentence can for example be *who know Java*. A relative sentence is constructed by first creating a *verb phrase* (VP) from a verb and an object. This verb phrase is then used together with a constant operation which\_RP to create a *relative clause*. We can then finally convert the relative clause into a relative sentence. This is achieved by using a self made operation named mkRS', the purpose of this operation is to make the code easier to read and also in the future reuse code.

The only thing that is left is to combine a noun with a relative sentence, e.g. combine *people* with *who know Java*. This is done by using the operation mkCN to create a common noun (CN). As CN's do not have any determiners, we have to construct a noun phrase together with the determiner aPl\_Det in order to to only allow translation of plural forms.

```
1 concrete InstrucsEng of Instrucs = open SyntaxEng, ParadigmsEng in {
   lincat
     Instruction = NP ;
3
      Subject = N;
4
     Relation = RS ;
5
     Object = NP ;
6
   lin
8
      MkInstruction subject relation = mkNP aPl_Det (mkCN subject relation) ;
9
      People = mkN "person" "people" ;
10
      Know object = mkRS' (mkVP (mkV2 (mkV "know") object)) ;
11
     Java = mkNP (mkPN "Java") ;
12
13
14
        mkRS' : VP -> RS = \vp -> mkRS (mkRCl which_RP vp) ;
15
16 }
```

Figure 9: English concrete syntax using the RGL

#### 1.5.2 *Generalizing the concrete syntax*

The English concrete syntax which uses the RGL is more complicated than the first version which only concatenates strings. In order to motivate why one shall use the RGL, this section describes how the concrete syntax can be generalized into an *incomplete concerete syntax* and then be instantiated by two concrete syntaxes, one for English and one for Swedish.

#### *An incomplete concrete syntax*

As we already have designed the concrete syntax for English, we can fairly easy convert it to a generalised version. The incomplete concrete syntax can be seen in Figure 10. We no longer have any strings defined, as we want to keep

the syntax generalised. Constant operations are used in place of strings, and they are imported from the lexicon interface LexInstrucs.

```
incomplete concrete InstrucsI of Instrucs = open Syntax, LexInstrucs in {
2
    Instruction = NP ;
3
     Subject = N;
    Relation = RS ;
    Object = NP ;
6
7
8 lin
    MkInstruction subject relation = mkNP aPl_Det (mkCN subject relation);
9
    People = people_N ;
10
    Know object = mkRS' (mkVP (know_V2 object));
11
    Java = java_NP ;
12
13
14
      mkRS' : VP -> RS = \vp -> mkRS (mkRCl which_RP vp) ;
15
16 }
```

Figure 10: Incomplete concrete syntax

LexInstrucs is an *interface*, which means that it only provides declarations. Figure 11 shows that we have one operation declaration for each word we want to use in the concrete syntax. Because we do not implement the operations, it is possible to create multiple instances of the lexicon where each one can implement the lexicon differently.

```
interface LexInstrucs = open Syntax in {
  oper
  person_N : N ;
  know_V2 : V2 ;
  java_NP : NP ;
  6 }
```

Figure 11: Lexicon interface

Figure 12 shows how the operations defined in LexInstrucs are implemented in LexInstrucsEng, we represent the words in the same way as in the old version of the concrete syntax for English.

```
instance LexInstrucsEng of LexInstrucs = open SyntaxEng, ParadigmsEng in {
  oper
  person_N = mkN "person" "people";
  know_V2 = mkV2 (mkV "know");
  java_NP = mkNP (mkPN "Java");
}
```

Figure 12: Lexicon instantiation of English

Figure 13 shows another instance of LexInstrucs, the lexicon for Swedish.

```
instance LexInstrucsSwe of LexInstrucs = open SyntaxSwe, ParadigmsSwe in {
  oper
  person_N = mkN "person" "personer";
  know_V2 = mkV2 (mkV "kunna" "kan" "kunna" "kunde" "kunnat" "kunna");
  java_NP = mkNP (mkPN "Java");
}
```

Figure 13: Lexicon instantiation of Swedish

## Why can't we define know\_V2 as just mkV2 (mkV "kan")?

We are now ready to instantiate the incomplete concrete syntax. The code below describes how InstrucsI is instantiated as InstrucsEng. Note how we override Syntax with SyntaxEng and LexInstrucs with LexInstrucsEng.

```
concrete InstrucsEng of Instrucs = InstrucsI with
(Syntax = SyntaxEng),
(LexInstrucs = LexInstrucsEng)
** open ParadigmsEng in {}
```

Figure 14: English instantiation of the incomplete concrete syntax

Analogously, we create an instance for Swedish concrete syntax by instantiating InstrucsI and overriding with different files.

```
concrete InstrucsSwe of Instrucs = InstrucsI with
(Syntax = SyntaxSwe),
(LexInstrucs = LexInstrucsSwe)
** open ParadigmsSwe in {}
```

Figure 15: Swedish instantiation of the incomplete concrete syntax

If we load the GF-shell with InstrucsEng.gf and InstrucsSwe.gf we can make the following translation from English to Swedish.

```
1 Instrucs> p -lang=InstrucsEng "people who know Java" | l -lang=InstrucsSwe
2 personer som kan Java
4 personer som kan Java
5 6 personer som kan Java
```

Figure 16: Swedish instantiation of the incomplete concrete syntax  $\,$ 

Why we get three results is unknown at the moment. Whats really interesting is that we can translate Instrucs formulated in English and Swedish into Solr-syntax.

#### 2.1 REQUIREMENTS SPECIFICATION

## 2.1.1 Generation of mock data

As described in Section 1.2, we want to develop an application which can translate natural language questions that refers to entities in a database or index owned by a software development company. This project has been made with strong collaboration with Findwise, a company with focus on search driven solutions. Findwise has an index with information about employees, projects and customers, however, it is not possible to use their information because it is confidential and cannot be published in a master thesis. A different approach to get hold of relevant data is to generate mock data that is inspired by Findwise's data model. Mock data in this project is simply generated data from files that can be used to simulate a real world example application.

## 2.1.2 Grammar development

The grammar in Section 1.4.1 can only translate the question people who know Java in English and Swedish into Solr query language. The grammar needs to be extended to handle *any* programming language that exists in the mock data, not only Java. In addition, it also needs to support other questions involving not only people, but customers and projects.

#### 2.1.3 Suggestions

If a user has no idea of which instructions the application can translate, how can she use the application? This thesis uses a narrow application grammar, which means that it only covers specified sentences. Therefore, if a sentence has one character in the wrong place, GF will not be able to translate anything. This problem can be solved by using a wide coverage grammar, an example of an application that adopts this technique is the GF android app [5, p. 41]. This project, however, does not.

GF has the power to suggest valid words of an incomplete sentence by using incremental parsing [6]. This means that even though a user do not know what to type, the application can suggest valid words to use. If the user chooses to add one of those words, the suggestion engine can show a new list of words that will match the new partial sentence.

However, this method does not support the use of only keywords, since one cannot start a sentence with for example the word Java. It it also inflexible since it does not support the use of words outside the grammar, e.g. all people who know Java.

This thesis takes a different approach on a suggestion engine. Instead of suggesting one word at a time, one can suggest a whole sentence based on what the user has typed so far. This is achieved by generating all possible sentences that the application can translate and indexing them in Apache Solr. This makes it very easy to search on matching sentences, we also gain powerful techniques such as approximate string matching.

By using this approach, if a user types a sentence in the application, it will search in the index on instructions related to the string and retrieve the most relevant instructions.

As the suggestion engine uses a search platform, it is possible to type anything and get suggestions, even only keywords like 'people java' will suggest instructions that can be formulated with these two words.

#### 2.1.4 Runtime environment

The chosen programming language for this project is Java. The main reason is because it is Findwise's primary programming language. It is also very well known among many companies in the world. Many professional Java-developers adopts a specific development platform, Java Enterprise Edition (Java EE). This platform provides many libraries that can be scaled to work in an enterprise environment. This project also adopts Java EE.

## Handling dependencies

A typical Java EE project make use of several libraries, in computer science terms we say that a project can have other libraries as *dependencies*. It is not unusual that these libraries also have their own dependencies. Larger projects can therefore have a lot of dependencies, so many that it becomes hard to keep track of them. This project make use of an open source tool called Apache Maven to handle dependencies. One simply list all libraries the project shall have access to, then Maven will automatically fetch them and their dependencies. This also makes the application more flexible, as it do not have to include the needed libraries in the application.

The parser would not be able to parse the word all Input and output presentation

Besides handling translation and suggestions, the application also needs to handle input and present its results in some way. This application takes input and presents output by using a web gui<sup>1</sup>.

To summarize, this application is a web application built in Java EE and uses Apache Maven for library management.

## 2.1.4.1 Running the application

Web applications built in Java are usually has the WAR file format. It is a special JAR-file which includes classes, dependencies and web pages. This project uses an open source web server called Apache Tomcat to host a web application by exporting our application as a WAR-file. Apache Tomcat will make the application available by using HTTP-requests and spawn a new thread for each request.

Details about the runtime environment can be found in Appendix B.

#### 2.2 GRAMMAR DEVELOPMENT

This section continues the work on the grammar introduced in Section 1.4.1.

#### 2.2.1 Supported instructions

The example grammar could only translate one instruction. This instruction in English is *people who know Java*. It is easy to extend this grammar to support more programming languages, for example, to support *Python* one can add a function Python: Object in the abstract syntax and implement it as Python = "python" in the concrete syntaxes. However, this approach makes the grammar inflexible because we need to extend the grammar every time we want to add a new programming language.

#### 2.2.2 *Names*

Defining a new function for each programming language is not a good idea, it forces us to update the grammar every time we want it to support a new programming language. A better solution would be to make one function that could be used by any programming language.

One intuitive approach to solve this problem is to create a function MkObject: String -> Object. The implementation for this function would be

<sup>1</sup> http://en.wikipedia.org/wiki/Graphical\_user\_interface

```
1 -- Abstract syntax
2 MkObject : String -> Object ;
3 -- RGL implementation
4 MkObject str = mkNP (mkPN str.s) ; -- PN = Proper Name
5 -- Solr implementation
6 MkObject str = str.s ;
```

Figure 17: Intuitive approach on names

The GF-code compiles, and the parsing and linearization by using Solr query language works. Unfortunately, this approach does not work with the RGL. GF cannot create a proper name by using an arbitrary string. Why?

Fortunately, there exists a built in category which can be used for exactly these situations. We use the category Symb, along with the function MkSymb: String -> Symb to represent arbitrary strings. We can then use the function SymbPN to create a proper name and finally create a noun phrase.

```
1 -- Abstract syntax
2 MkObject : Symb -> Object ;
3 -- RGL implementation
4 MkObject symb = mkNP (SymbPN symb) ; -- PN = Proper Name
5 -- Solr implementation
6 MkObject symb = symb.s ; -- Symb has the type { s : Str }
```

Figure 18: Working approach on names

By using this solution, we can translate the sentence *people who know foo*, where *foo* can be anything.

#### 2.2.3 *More instructions*

We have only covered translation of one sentence in the application so far. Figure 19 shows all sentences that the end application supports.

```
English

people who know Java

people who work in London

people who work with Unicef

customers who use Solr

Solr query language

q= object_type : Person AND KNOWS : Java

q= object_type : Person AND WORKS_IN : London

q= object_type : Person AND WORKS_WITH : Unicef

q= object_type : Customer AND USES : Solr

q= object_type : Project AND USES : Solr
```

Figure 19: All sentences supported by the application

Two more cases has been added to instructions regarding *people*. In addition, two new type of instructions has been added, translations about customers and

projects. Note that Figure 19 only shows instances of instructions. As described in the previous section, the grammar uses names that can take on any string for specific parts of the sentences. This means that the words *Java*, *London*, *Unicef* and *Solr* can be exchanged into anything.

## 2.2.4 Extending the grammar

It is not trivial to extend the grammar to support the instructions described in the previous section.. One has to take into account that it shall not be possible to translate invalid instructions like *projects who work in London*.

## 2.2.4.1 Abstract syntax

The first step towards a solution to this problem is to modify the abstract syntax. We begin by removing the category Subject and replacing it with three new categories: Internal, External and Resource. The function People will return a value of the type Internal and Customer and Project will return values of the types External and Resource respectively.

```
-- Instructions.gf

cat

Internal;

External;

Resource;

fun

People : Internal;

Customer : External;

Project : Resource;
```

Figure 20: Abstract syntax with new categories and functions for subjects

In addition to adding new subject categories, three new categories for relations are also introduced: InternalRelation, ExternalRelation and ResourceRelation (Relation is removed). The idea is to link subject values to the correct relation types. For instance, we link a value of the type Internal with a value of type InternalRelation.

All relation functions are changed to return the correct type. For example, Know is changed to return a value of the type InternalRelation. This means that only People can be used together with Know, as desired. Figure 21 also shows the new supported relations.

```
1 cat
2   InternalRelation;
3   ExternalRelation;
4   ResourceRelation;
5   fun
6   Know : Object -> InternalRelation;
7   UseExt : Object -> ExternalRelation;
8   UseRes : Object -> ResourceRelation;
9   WorkIn : Object -> InternalRelation;
10   WorkWith : Object -> InternalRelation;
```

Figure 21: Abstract syntax with new categories and functions for relations

The last thing to modify is how subjects and relations are combined. The function MkInstruction is replaced by three new functions: InstrucInternal, InstrucExternal and InstrucResource. However, as we do not need to make any distinction between different type of instructions at this level, all three functions returns a value of the type Instruction.

```
1 cat
2  Instruction;
3 fun
4  InstrucInternal : Internal -> InternalRelation -> Instruction;
5  InstrucExternal : External -> ExternalRelation -> Instruction;
6  InstrucResource : Resource -> ResourceRelation -> Instruction;
```

Figure 22: Abstract syntax with new categories and functions for instructions

### 2.2.4.2 Concrete syntax for RGL

As the abstract syntax has changed, the concrete syntaxes has to be modifed as well. This section explains how the generalised concrete syntax which uses the RGL is implemented.

Figure 23 shows how the categories has been implemented. The new categories are implemented in the same way as the previous.

```
lincat
linc
```

Figure 23: RGL concrete syntax with new category implementations

The new subject functions are implemented in the same way as People.

```
1 lin
2 People = person_N;
3 Customer = customer_N;
4 Project = project_N;
```

Figure 24: RGL concrete syntax with new subject implementations

Four new relation functions are added. Line 5-6 in Figure 25 shows how we use the verb work\_V together with two prepositions, in\_Prep and with\_Prep in order correctly linearize into *work in foo* and *work with foo* respectively (*foo* is the value of object. The relation implementations make use of an operation mkRS' to reuse code.

```
1 lin
2 Know object = mkRS' (mkVP know_V2 object);
3 UseExt object = mkRS' (mkVP use_V2 object);
4 UseRes object = mkRS' (mkVP use_V2 object);
5 WorkIn object = mkRS' (mkVP (mkV2 work_V in_Prep) object);
6 WorkWith object = mkRS' (mkVP (mkV2 work_V with_Prep) object);
7 8 oper
9 -- Make a relative sentence
10 mkRS': VP -> RS = \vp -> mkRS (mkRCl which_RP vp);
```

Figure 25: RGL concrete syntax with new relation implementations

Subjects and relations are combined as before, but as this solution has three functions instead of one, a new operation mkQ has been defined in order to reuse code.

Figure 26: RGL concrete syntax with new instruction implementations

## 2.2.4.3 Concrete syntax for Solr

This section describes how the concrete syntax for Solr is modified to work with the new abstract syntax.

The new categories are all defined as strings.

```
lincat
Instruction = Str;
Internal, External, Resource = Str;
InternalRelation, ExternalRelation, ResourceRelation = Str;
Object = Str;
```

Figure 27: Solr concrete syntax with new implementation of categories

Subject types are hard coded into strings. We assume that these strings exists in the Solr index.

```
1 lin
2 People = "Person";
3 Customer = "Organization";
4 Project = "Project";
```

Figure 28: Solr concrete syntax with new subject implementations

We also make an assumption about how the relations are defined in the Solr index.

```
1 lin
2 Know obj = "KNOWS" ++ ":" ++ obj ;
3 UseExt obj = "USES" ++ ":" ++ obj ;
4 UseRes obj = "USES" ++ ":" ++ obj ;
5 WorkWith obj = "WORKS_WITH" ++ ":" ++ obj ;
6 WorkIn obj = "WORKS_IN" ++ ":" ++ obj ;
```

Figure 29: Solr concrete syntax with new relation implementations

As in the concrete syntax for RGL, also an operation is defined and used by the three functions.

Figure 30: Solr concrete syntax with new instruction implementations

#### 2.3 BOOLEAN OPERATORS

The grammar is now powerful enough to translate a variety of questions. To make it even more powerful, one could use boolean operators in order to combine relations. For example, an instruction that could be useful is *people who know Java and Python*. Another useful instruction is *people who know Java and work in Gothenburg*. This section explains how the grammar can be extended to support these kind of instructions.

In addition to the previous example with the boolean operator *and*, we will also add support for the boolean operator *or*. We begin by adding functionality to support boolean operators to combine values of the type 0bject. As seen in Figure 31, two new functions are defined in the abstract syntax to handle these cases, one for each operator.

```
1 lin
2 And_0 : Object -> Object ;
3 Or_0 : Object -> Object ;
```

Figure 31: Abstract syntax for boolean operators and objects

The RGL implementation is shown in Figure 32.

```
1 lin
2 And_0 o1 o2 = mkNP and_Conj o1 o2;
3 Or_0 o1 o2 = mkNP or_Conj o1 o2;
```

Figure 32: RGL concrete syntax for boolean operators and objects

The Solr implementation is shown in Figure 33. We add AND or OR between the two objects.

```
1 lin
2 And_0 o1 o2 = "(" ++ o1 ++ "AND" ++ o2 ++ ")";
3 Or_0 o1 o2 = "(" ++ o1 ++ "OR" ++ o2 ++ ")";
```

Figure 33: Solr concrete syntax for boolean operators and objects

It is now possible to express *people who know Java and Python*. In order to use boolean operators with whole relations like *people who know Java and work in Gothenburg*, the grammar has to be further extended.

We must also take into account that it shall only be possible to combine relationship that are possible to express in the current sentence. Therefore, we need to define the boolean logic three times, as we have three different types of instructions.

Figure 34: Abstract syntax for boolean operators and relations

Instead of combining noun phrases as in Figure 32, here we combine relative sentences in the RGL implementation.

```
1 lin
2   InternalAnd rs1 rs2 = mkRS and_Conj rs1 rs2;
3   InternalOr rs1 rs2 = mkRS or_Conj rs1 rs2;
4   ExternalAnd rs1 rs2 = mkRS and_Conj rs1 rs2;
6   ExternalAnd rs1 rs2 = mkRS or_Conj rs1 rs2;
7   ResourceAnd rs1 rs2 = mkRS and_Conj rs1 rs2;
9   ResourceOr rs1 rs2 = mkRS or_Conj rs1 rs2;
```

Figure 35: RGL concrete syntax for boolean operators and relations

The Solr implementation is fairly straight forward, similarly as with values of the type Object, we also add AND or OR between the strings. The only difference is that we do it three times as we have three different subject types.

Figure 36: Solr concrete syntax for boolean operators and relations

## 2.4 SUGGESTION ENGINE

This section continues where Section 2.1.3 left off. The suggestion engine shall generate all possible instructions in all natural languages and store them in an Apache Solr index. It is suitable to use the *generator* which GF creates to generate abstract syntax trees and linearize them into the specified concrete languages (English and Swedish in this case).

The generator can be accessed through the GF-shell. Figure 37 shows how the function generate\_trees is executed to generate all trees with the *depth* 4. By depth, we mean the maximum number edges between a leaf and the root element.

```
Instrucs> generate_trees
InstrucExternal Customer (UseExt (MkObject (MkSymb "Foo")))
InstrucInternal People (Know (MkObject (MkSymb "Foo")))
InstrucInternal People (WorkIn (MkObject (MkSymb "Foo")))
InstrucInternal People (WorkWith (MkObject (MkSymb "Foo")))
InstrucResource Project (UseRes (MkObject (MkSymb "Foo")))
```

Figure 37: generate\_trees is used to create all abstract syntax trees with max depth 4

Figure 37 shows 5 trees, but there exists many more trees. The reason GF only generates 5 trees is because of the default depth setting is 4. If we increase the depth we will obtain more trees, as it then will include trees containing boolean operators. By increasing the max depth to 5, GF will generate 36 trees. With depth 6, GF will generate 1653 trees.

Actually, there exists infinitely many trees, as we have recursive functions in the abstract syntax.

It is often good to visualize trees to understand them better. Figure 38 shows two abstract syntax trees, the first one with depth 4 and the second with depth 5. One can easily see that the former has maximum 4 edges between root and leaf, and the latter has maximum 5 edges between root and leaf.

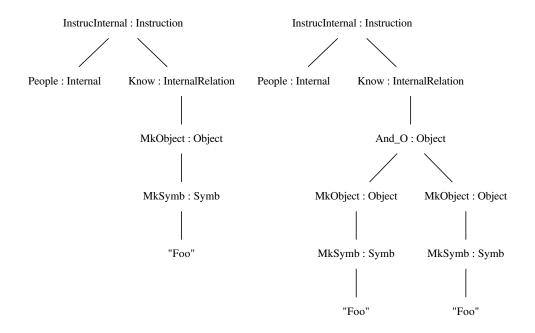


Figure 38: Visualization of abstract syntax trees with depth 4 and 5

## 2.4.1 *Populating the Solr index*

It is now time to linearize the generated trees and store them in a Solr index that is dedicated to store linearizations. By doing so, we will be able to search on instructions by using words that exists in the instructions. What we cannot do is to search on names, because the names does not occur in the instructions, instead they only contain a placeholder for a name ("Foo"). It will therefore only suggest instructions like *people who know Foo and Foo* which is a useless suggestion.

We want to be able to suggest relevant names, if the user database contains a person which knows Java, then we also want to suggest instructions based on that name. This requirement forces us to change the application once more.

A naïve solution would be to fetch all distinct names from the database and create all possible instructions that a user shall be able to express with these names. For an instruction like *people who know Foo or Foo and works in Foo* and if the database contains 10 programming languages and 10 cities we would then have to generate 2\*10\*10 = 200 instructions. This is clearly not suitable, as GF generates 1653 trees (with depth 6).

A better approach on the problem is to store all distinct names in a separate index. When a user begins to type an instruction, the application checks each word the user has typed. If a word exists in the name-index, then treat it as a name and replace it with Foo, then query the linearizations index. Retrieve the

results, and change back Foo to the original name. However, as the application do not make any distinction between different type of names, we could end up with suggestions like *people who work in Python*, because *Python* was replaced by *Foo*. Luckily, this problem can be resolved by introducing a distinction between different types of names in the grammar.

This application uses four different kind of names. Programming languages are used together with the Know relation. Organizations are used with the Work\_With relation. Locations are used with the Work\_In relation. Lastly, modules are used with the Use relation. We extend the grammar to support these new name types.

Figure 39 shows the new abstract syntax. Line 3 defines new name types. Line 7-10 defines how the names are instantiated. Lines 13-23 defines how names can be combined by using boolean operators. Note how we use the type Skill for programming languages.

```
1 cat
2 -- Names
  Skill; Organization; Location; Module;
3
4
5 fun
  -- Create unknown names
6
  MkSkill : Symb -> Skill ;
8 MkOrganization : Symb -> Organization ;
9 MkModule: Symb -> Module ;
  MkLocation : Symb -> Location ;
   -- Boolean operators for Organizations
   And_S : Skill -> Skill -> Skill ;
13
   0r_S : Skill -> Skill -> Skill ;
14
15
   And_0 : Organization -> Organization -> Organization ;
16
   0r_0 : Organization -> Organization -> Organization ;
17
18
  And_L : Location -> Location -> Location ;
22 And_M : Module -> Module -> Module ;
or_M : Module -> Module -> Module ;
```

Figure 39: Abstract syntax with new name types

The concrete syntax for these new functions are implemented in the same way as the ones we removed (category 0bject and functions Mk0bject,  $And_0$  and  $0r_0$ ). We have omitted the new concrete syntaxes from the thesis as they do not contribute to anything new.

As the grammar has changed, also the abstract syntax trees has changed. Figure 40 shows how GF now generate all trees with depth 4.

```
Instrucs> generate_trees
InstrucExternal Customer (UseExt (MkModule (MkSymb "Foo")))
InstrucInternal People (Know (MkSkill (MkSymb "Foo")))
InstrucInternal People (WorkIn (MkLocation (MkSymb "Foo")))
InstrucInternal People (WorkWith (MkOrganization (MkSymb "Foo")))
InstrucResource Project (UseRes (MkModule (MkSymb "Foo")))
```

Figure 40: Abstract syntax trees with name types

As the index stores the linearizations of each tree it is important to post process each linearization in order to preserve the type information. Currently, the type of each name would be lost when linearized, for example MkSkill (MkSymb "Foo") is linearized into just "Foo" if using the english concrete syntax.

To preserve type information, we replace each "Foo" with the current name type + an index. Figure 41 shows an example.

```
InstrucInternal People (InternalAnd (Know
(And_S (MkSkill (MkSymb "Skill0")) (MkSkill (MkSymb "Skill1"))))
(WorkIn (MkLocation (MkSymb "Location0"))))
```

Figure 41: An abstract syntax tree with name types and changed names

The previous example linearizes into *people who know Skill0 and Skill1 and who work in Location0* by using the concrete syntax for English. We generate all trees again, linearize them into all natural languages and store them in the linearizations index.

In addition, as we store each name in a separate index, we associate each name with its type. By doing so, we can easily find out if a word is a name and then find out what type that name has.

The grammar and the Solr indices are now complete. The application can now suggest relevant sentences even though the user only has typed names (provided that the names exists in the name index). Figure 42 shows the pseudocode for the suggestion algorithm with informative comments. This algorithm is executed by the Java-application when a user has typed a partial question.

```
suggestions(sentence) {
      // sentence = "persons who knew java or python and work in London"
2
      // names[] = {Java, Python, London}
3
      names[] = extractNames(sentence);
5
      // "persons who knew java or python and work in London" ===>
6
      // "persons who knew Skill0 or Skill1 and work in Location0"
      sentence = replaceNamesWithTypes(sentence, names);
8
      // suggestions =
10
      // { "people who know Skill0 or Skill1 and who work in Location0", ... }
11
      suggestions[] = findSentences(sentence);
12
13
      foreach suggestion in suggestions {
14
          // "people who know Skill0 or Skill1 and who work in Location0" ===>
15
          // "people who know Java or Python and who work in London"
16
          suggestion = restoreNames(names, suggestion);
17
      }
18
      return suggestions;
19
20 }
```

Figure 42: Pseudocode for the suggestion algorithm

## 2.4.1.1 Supporting invalid sentences

This section aims to add better accuracy of the suggestion engine by linearizing different variations of a sentence. While the linearization function in GF returns a string representation of a tree, there also exists a parameter -list which allows GF to return all semantically equivalent ways of expressing a sentence.

```
Languages: InstrucsEng
Instrucs> p "people who know Java" | l -list
people who know Java, people's who know Java
```

Figure 43: Linearization to InstrucsEng using -list

#### Here we actually get four results, three duplicates! Fix, but how?

Figure 45 shows that people who know Java actually can be expressed in two ways. We add both linearizations as a list to the same object in the linearizations index, and we list the one we think is the most suitable in the beginning of the list. This makes it possible to search for something similar to what the grammar can parse, but get a more suitable suggestion. For instance, if type *people's who know Java* then the application will match the lesser suitable sentence in the index, but return *people who know Java* as a suggestion.

It is possible to add more linearizations than those listed in Figure 45. GF

adopts the symbol pipe symbol to express that two elements are semantically equivalent.

We extend the grammar to treat a subject in singular form the same as a subject in plural form. I.e. the sentences *a person which knows Java* is the same as *people who know Java*. As we treat them equivalent, they will have the same abstract syntax tree, and this tree will linearize to only one Solr query, hence if we translate *a person who knows Java* into Solr, we will obtain a query that retrieves multiple results. The implementation of this extension is achieved by modifying the operation mkI.

Figure 44: Treating singular form equivalent to plural form

The second extension is to treat the *progressive form* of a verb as the same as the regular form. A progressive form of a verb indicates that something is happening right now or was happening or will be happening. The grammar in this project only supports present tense, so it will only cover progressive verbs which expresses that something is happening right now. This is achieved by using the variance function again.

```
1 oper
2 mkRS' : VP -> RS = \vp -> mkRS (mkRCl which_RP (vp | progressiveVP vp));
```

Figure 45: Treating progressive verb equivalent normal form

However, not all verbs can be used in progressive form. An example of such verb is *know*. An example of *know* in progressive form is *people who are knowing Java* which clearly is incorrect. Although it might look ugly, it is not an issue for our application as the suggestion engine only suggest the most suitable suggestion. The extension will contribute to make the suggestion engine richer as it allows users to use incorrect instructions.

## 2.5 GENERATION OF MOCK DATA

This section describes how the data used by the application is generated. In order to generate data, we must know what to generate. From Section 2.2.3 we know the Solr queries our index must support. We have three different types of objects: *Customer, Person* and *Project*. Each of these types of objects has their own data. A customer shall have one value, a list of technologies it uses. A person shall have three values, a list of programming languages it knows, a

list of cities it works in and a list of organizations it has been working with. A project shall have one value, the same as a customer, a list of technologies it uses. In addition to these requirements by the grammar, customers and persons also have names. Figure 46 shows an example of data that could exists in the Solr index.

```
1 { // Customer
    "name" : "Amnesty"
   "object_type" : "Customer",
   "USES" : ["Solr", "Tomcat", "GF"]
4
5 },
6 { // Person
    "name" : "Jane Doe"
   "object_type" : "Person",
8
   "KNOWS" : ["Java", "Python", "C"],
   "WORKS_IN" : ["London", "Gothenburg"],
10
   "WORKS_WITH" : ["Amnesty", "Unicef"]
11
12 },
13 { // Project
    "object_type" : "Project",
14
   "USES" : ["Android", "GF"]
15
16 }
```

Figure 46: Example data in JSON

Mock data is generated by combining data from text-files. We have two text-files concerning personal names (first\_names.txt and last\_names.txt). One text-file with organization names (charity\_organizations.txt). One text file about programming languages (programming\_languages.txt). Lastly, one text file containing cities (cities.txt).

An object is generated by taking one value from each text file that the object needs. For instance, to create an object of the type Person, we fetch values from first\_names.txt, last\_names.txt, programming\_languages.txt, cities.txt and charity\_organizations.txt. The object is then exported to Solr to be stored in the index.

3

# RESULTS

## **DISCUSSION**

## 4.1 CONTRIBUTIONS

My work has improved PGF, at least a bit Issue with the suggestion algorithm, cannot take more than one word...

#### 4.2 TO DOS

How we add a special behavior of names with spaces in it.

Add "more sophisticated suggestion engine with graph database. Eg. if one type "people" then it shall recognize it as a node and check all distinct edges from that node as relationships to other nodes and suggest to autocomplete all those nodes.

## 4.3 NEGATIVE THINGS

Generates three trees for each instruction (p "people who know Java or Python and who work in London" Can just generate all instructions in all languages and add them to solr. No need for translating then.



#### GF RUNTIME SYSTEMS AND LIBRARIES

#### A.1 GF RUNTIME SYSTEMS

While the GF-shell is a powerful tool, it is not very convenient to interact with when programming an application. Luckily, the creators of GF has thought about this and built embeddable runtime systems for a few programming languages [7, p. 3]. These runtime systems makes it possible to interact with a grammar directly through language specific data types. We have chosen to work with the Java-runtime system in this project.

## A.1.1 Portable Grammar Format

The GF-shell interacts with grammars by interpreting the GF programming language. This allows us to write our grammars in an simple and convenient syntax. Interpreting the GF programming language directly is however a heavy operation[7][p. 13], especially with larger grammars. This is where the Portable Grammar Format (PGF)[7][p. 14] comes in. PGF is a custom made machine language which is dynamically created by compiling a grammar with GF into a PGF-file. The runtime systems works exclusively with PGF-files.

#### A.1.2 GF libraries

In order to use the Java-runtime, we first need to generate a few libraries which is used by the runtime system. The Java-runtime system depends on the C-runtime system and a special wrapper between the C- and the Java-runtime. The libraries are platform dependent and at the time of writing, no pre-generated libraries exists. We therefore need to generate the libraries by ourselves. We will start by generating and installing the C-libraries. We will then go through how we can generate the wrapper library.

## A.1.2.1 Building and installing the C-runtime

Start by fetching the needed dependencies

sudo apt-get install gcc autoconf libtool

Download the latest source code of GF from GitHub.

git clone https://github.com/GrammaticalFramework/GF.git

It is also possible to download the project as an archive by visiting the repository url.

You will receive a directory GF/. Change the current working directory to the C-runtime folder.

```
cd GF/src/runtime/c

Generate a configuration file
```

Generate a configuration me

```
autoreconf -i
```

Check that all dependencies are met

```
./configure
```

If there exists a dependency that is not fulfilled, try to install an appropriate package using your package-manager.

Build the program

```
make
Install the libraries you just built
sudo make install
```

The C-runtime for PGF is now installed.

A.1.3 Building and installing the C to Java wrapper library

Start by installing the needed dependency

```
sudo apt-get install g++
```

The wrapper is built by using a script which is executed in Eclipse. This step assumes that you have Eclipse installed with the CDT-plugin. If you don't have Eclipse, you can download it with your package manager, just do not forget to install the CDT-plugin.

Start Eclipse and choose File > Import.. in the menu. Choose Import Existing Projects into Workspace and click on the Next button. Select Browse... and navigate to the location where you downloaded GF from GitHub and press enter. Uncheck everything except jpgf and click on Finish. You have now imported the project which can build the Java-runtime system.

Unfortunately, the build-configuration for the jpgf-project is not complete at time of writing. We therefore need to make additional adjustments in order to build the project.

Right-click on the project and choose Properties. Click on Includes which is located below GCC C Compiler. You will see one directory listed in the textbox. You need to check that this directory exists. If not, change it to the

correct one. For instance, this tutorial was written using Ubuntu 14.04 amd64 with OpenJDK 7, hence the correct directory is

```
/usr/lib/jvm/java-7-openjdk-amd64/include
```

The project also needs another flag in order to build properly. In the Propertieswindow, click on Miscellaneous below GCC C Compiler. Add -fPIC to the text field next to Other flags. Click on Ok to save the settings.

You can now build the project by choosing Project > Build Project in the menu. If everything went well you shall have generated a file libjpgf.so in Release (posix)/. You can check that the dependencies of libjpgf.so is fulfilled (i.e. it finds the C-runtime) by executing the following in a terminal

```
ldd libjpgf.so
```

If you cannot see not found anywhere in the results, all dependencies are met. However if some dependencies are missing, try to locate the files and move them to /usr/local/lib (or /usr/lib in some distros).

The last step is to move libjpgf.so into the correct directory.

```
mv libjpgf.so /usr/local/lib (or /usr/lib)
```

You have now installed the wrapper library.

#### A.1.4 Using the Java-runtime

Have not started on this yet... Don't forget how to set java lib path when using tomcat!

B

## IMPLEMENTATION DETAILS

- B.1 MOCK DATA GENERATION
- B.2 WEB APPLICATION

# ACRONYMS

GF Grammatical Framework

RGL Resource Grammar Library

Java EE Java Enterprise Edition

PGF Portable Grammar Format

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