# **Manual for DependencyVectors 2.6**

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This is a semi-technical document on how to use the DEPENDENCYVECTORS software package to produce dependency-based vector spaces. The concept of dependency spaces and ideas as to their applications can be found in [1] and [2]. DEPENDENCYVECTORS now supports both the MINIPAR and the Clark&Curran dependency parser. The installation is described in the README file; implementation details can be found in the javadoc documentation (see README).

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# 1 Licence and Credit

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Credit goes to Raquel G. Alhama for her implementation of the Spanish FreeLing interface and her permission to include it in the DV distribution.

## **2 Using DEPENDENCY VECTORS**

## 2.1 By way of introduction: The sample directory

The directory sample contains "minimal" running examples for creating a semantic space for English and Spanish.

**English** For English, there is a two-sentence corpus in MINIPAR "full" format (sample\_corpus\_full), in MINIPAR triple format (sample\_corpus\_triples), and in Clark and Curran output format (sample\_corpus\_cnc); as well as a set of two target words (targets). Executing one of the scripts create\_space.sh, create\_space\_triples.sh or create\_space\_cnc.sh will run the complete pipeline and create a space in the subdirectory vectors. These scripts can serve as templates for own calls of the DEPENDENCYVECTORS pipeline.

**Spanish** For Spanish, there is a short corpus in FreeLing format (sample\_corpus\_freeling) which is processed by calling create\_space\_freeling.sh.

#### 2.2 Architecture

The DEPENDENCY VECTORS software package contains three programs, corresponding to three steps of constructing a dependency-based semantic space model.

- 1. ExtractBasisElements: Choice of basis elements. Different from traditional wordbased semantic space models, which usually use the most frequent context words, DE-PENDENCYVECTORS models can use any set of basis elements (BEs). These have to be extracted (together with their frequencies) from the corpus in the first step. Additionally, ExtractBasisElements extracts frequencies for the target words and the total number of paths which are necessary for step 3.
- 2. ExtractSpace: Construction of semantic space. This constructs an actual DEPENDEN-CYVECTORS semantic space model from a corpus, given targets and basis elements.
- 3. LLT: Log-likelihood transformation. This performs a log likelihood transformation on a semantic space (optional).

It is recommended to call the three programs through the shell scripts in bin/. They communicate through files; the flow of information can be seen in Figure 1. All files (boxes) in the middle row are stored in the directory specified by the option targetdir and are named according to a naming convention (see Table 1) that reflects the fact that the two main parameters of the extraction are the context specification and path value functions. All programs support the concurrent processing of files with diffent parameters (see below).



Figure 1: Flow of Information in DEPENDENCY VECTORS

File	Naming convenion
Target frequencies	cs_pv.targets
BE frequencies	cs_pv.bes
Total frequency	cs_pv.total
Raw vectors	cs_pv.vectors
Transformed vectors	cs_pv.ll.vectors

 Table 1: Naming convention for files in targetdir (cs is name of context specification, pv name of path value function).

#### 2.3 Using ExtractBasisElements

This program extracts basis elements. Since there may be (too) many, if a lexical basis mapping (like the default) is used, ExtractBasisElements supports *purging*, i.e. the regular removal of the most infrequent basis elements. This is implemented as follows: if the list contains more than maxsize/ratio elements, the list is shortened to maxsize elements. This guarantees that at every point, maxsize *reliable* basis elements are available.

-corpus <name> : Location of corpus (default: System.in)

-ctype <name> : Corpus type (minipar, cando, or freeling)

-cutoff <int> : Ratio of basis elements to be deleted in each purge (default: 0.3)

-help : Display help and exit.

- -log <file> : Destination for the log file (default: log.txt)
- -maxsize <int> : Desired number of basis elements (default: 10000)
- -spec <file> : Name of file with context specification (default: all). The standard DEPENDEN-CYVECTORS distribution comes with five specs: contextspec\_{minimal,medium,rich,wide,soonly}.txt. The prefix contextspec is added automatically.
- **-targets <file>** : File containing target words
- -targetdir <file> : Data directory, used for writing output files (see Figure 1).
- -plain | -length | -oblique | -oblength : Path value functions provided by the standard DE-PENDENCYVECTORS distribution (default: all)
- -basisMapping <bm> : Basis mapping function (no default). Currently available: lex (use words as dimensions of the semantic space) and gramlex (use word-dependency relation pairs as dimensions of the semantic space).

If either -spec or the path value function is omitted, the extraction is run for *all* available values of that parameter, resulting in different file sets in the target directory.<sup>1</sup> Example call for ExtractBasisElements:

```
zcat bnc.parsetrees.gz | bin/ExtractBasisElements.sh
--targets targetsfile --targetdir data/bnc/
--plain --spec minimal.txt --lex
```

Note that after ExtractBasisElements is a good opportunity to sort out unwanted basis elements according to frequency or any other criterion; see the definition of the frequency file format below.

## 2.4 Using ExtractSpace

This program extracts semantic spaces, given sets of targets and basis elements. It supports incremental space building (to obtain learning curves) by using the -every option. The central data structure is implemented in two different ways. The default implementation is faster, but uses much memory. For the concurrent extraction of multiple spaces, I recommend using the -small option which may be slower, but saves memory<sup>2</sup>.

- -corpus <name> : Location of corpus (default: System.in)
- -ctype <name> : Corpus type (minipar, cando, or freeling)
- -every <num> : Incrementally write semantic space every <num> corpus bytes to file targetdir/cs\_pv.vectors.<index>
- -help : Display help and exit.
- -log <file> : Destination for the log file (default: log.txt)
- -small : Uses Semantic Space class with small memory footprint (recommended for concurrent extracting of multiple spaces, but possibly slower)
- -spec <file> : Name of file with context specification (default: all). The standard DEPENDEN-CYVECTORS distribution comes with five specs: contextspec\_{minimal,medium,rich,wide,soonly}.txt. The prefix contextspec is added automatically.
- -targetdir <file> : Data directory, used for reading input files and writing output files (see Figure 1).
- -plain | -length | -oblique | -oblength : Path value functions provided by the standard DE-PENDENCYVECTORS distribution (default: all)

<sup>&</sup>lt;sup>1</sup>The list of all context specifications is read from the variable <code>Parameters.allCSFiles</code>, and the list of all path value functions from <code>Parameters.allValuations</code>.

<sup>&</sup>lt;sup>2</sup>Note that the maximum size of processes on 32-bit machines is limited to about 1.8 GB

- **-nofrequencies** : Do not complain about missing frequencies in basis element and target files (see below).
- -basisMapping <bm> : Basis mapping function (no default). Currently available: lex (use words as dimensions of the semantic space) and gramlex (use word-dependency relation pairs as dimensions of the semantic space).

If either -spec or the path value function is omitted, the extraction is run for all available values of that parameter, resulting in different file sets in the target directory. Example call for ExtractSpace:

```
zcat bnc.parsetrees.gz | bin/ExtractSpace.sh
--targetdir data/bnc/ --every 10000000
--plain --spec minimal.txt --lex
```

Having individual target and basis element files for different parametrisations may seem unnecessary. However, recall that these files also contain frequencies (computed, for example, by ExtractBasisElements). These typically vary between parameterisations and are necessary for computing log likelihoods. Note that if you haven't computed the basis elements for all these parametrisations, the program will presumably fail while trying to open these files and give you surprising error messages.

To enable the extraction of semantic spaces with "raw counts", ExtractSpaces can run without this frequency information, but this is disabled by default as a security measure. Specify -nofrequencies if you want to enable this mode.

## 2.5 Using LLT and PMT

These program perform log-likelihood and pointwise mutual information transformations on a semantic spaces. In keeping with the arguments of the other programs, the name of the vector file is also specified by the context spec and path value functions, which again allows for concurrent processing.

-help : Display help and exit.

- -log <file> : Destination for the log file (default: log.txt)
- -spec <file> : Name of file with context specification (default: all). The standard DEPENDEN-CYVECTORS distribution comes with five specs: contextspec {minimal,medium,rich,wide,soonly}.txt.The prefix contextspec is
  - added automatically.
- -targetdir <file> : Data directory, used for reading input files and writing output files (see Figure 1).
- -plain | -length | -oblique | -oblength : Path value functions provided by the standard DE-PENDENCYVECTORS distribution (default: all)

Example call for LLT to convert spaces for all context specifications:

bin/LLT.sh --targetdir data/bnc/ --plain

## 2.6 Example

The directory sample contains "minimal" running examples for creating a semantic space for English and Spanish.

**English** For English, there is a two-sentence corpus in MINIPAR "full" format (sample\_corpus\_full), in MINIPAR triple format (sample\_corpus\_triples), and in Clark and Curran output format (sample\_corpus\_cnc); as well as a set of two target words (targets). Executing one of the scripts create\_space.sh, create\_space\_triples.sh or create\_space\_cnc.sh will run the complete pipeline and create a space in the subdirectory vectors. These scripts can serve as templates for own calls of the DEPENDENCY VECTORS pipeline.

**Spanish** For Spanish, there is a short corpus in FreeLing format (sample\_corpus\_freeling) which is processed by calling create\_space\_freeling.sh.

#### 2.7 Parsers

DV now supports the following parsers (available through the ctype option):

- Dekang Lin's MINIPAR (for English)
- Clark and Curran's C&C parser (for English)
- The FreeLing parser for Spanish and Catalan

#### 2.7.1 Details on String Handling

MINIPAR shows a somewhat unusual behaviour for parsers in that multi-word expressions can occur as single nodes; these nodes are labelled with strings including spaces. To correctly handle these cases, spaces (and a small number of other special characters) are replaced during processing. The replacements are given in Table 2. In addition, all words are lowercased, to generalise over the capitalisation of first words in sentenes. The replacements are defined (and can be altered) in the class MiniparEncoding. For technical reasons, it is not recommended that targets or basis elements contain spaces.

This replacement takes place both for corpora, and for the lists of basis elements and target words read from files. As a consequence, target word lists written by DEPENDENCYVEC-TORS into the target data directory can differ from the original target word lists through normalisation. For example, *mull over* will be replaced by *mull\_over*.

# 3 File formats

This section lists the formats of the various files.

#### 3.1 Targets file

One word (target) per line, everything else ignored. No comments allowed.

old	new
:	_COLON_
\t	_TAB_
" (double quote)	(empty string)
$\s$ (space)	_(underscore)
١	_BACKTICK_

Table 2: String Replacements in Corpus, Target, and BE expressions

## 3.2 Target/BE frequency file

Every line contains two tab-separated tokens: (1), the target or basis element, and (2), its frequency. No comments allowed.

## 3.3 Total path frequency file

Just one line, containing the string representation of a Double.

## 3.4 Vectors file

The first line contains a tab-separated list of all basis elements. All following lines contain first the target that is represented by that line, then a colon, and then the vector as a space-separated list of Doubles.

#### 3.5 Context specification file

The context specifications are stored in external files. Lines that begin with # are treated as comments and ignored, as are empty lines. Lines that specify path templates contain one or more edge templates, which are separated by =. Each edge template is a five-tuple, separated by colons (:). The first and second tokens specify the lemma and part of speech of the source node. The third token is the dependency relation label of the edge. The fourth and fifth tokens are the part of speech and lemma of the target node. For every of these tokens, users can specify the asterisk (\*), which will match everything. For examples, see the provided context specification files.

## 4 Modifications and extensions

If you implement any modifications or extensions to the DEPENDENCYVECTORS package, I would be very interested in hearing from you and merging the new code into the main development branch. If you have any trouble in understanding what's going on, let me know.

Almost all modifications and extensions should be possible by modifying exactly one place in the code, since all frontends (ExtractBasisElements, ExtractSpace, and LLT) use the same backend libraries.

## 4.1 Using another parser

This should (only) require extending or replacing the Corpus class, which can at the moment only parse MINIPAR-analysed corpora.

#### 4.2 Using a different basis mapping function

This requires two changes. First, a new class must be written that implements the BasisMapping interface. See the top of Parameters.java for the two built-in basis mapping functions as examples. Second, a new case must be added to the (if (mapping.equals(...)) conditional in the Parameters() constructor.

#### 4.3 Adding new context specifications

This requires putting the new context specification files (format see above) into the directory lib/contextspecs and adding the name to the Parameters.allCSFiles array. The filenames of context specification files must start with contextspec\_.

#### 4.4 Adding new path value functions

New path value functions can be added by extending the if valuation.equals (X) branch in the Parameters.pathValue method. The names of the new path value functions also have to be recorded in the Parameters.allValuations array. This makes them permissible command line arguments, and they can be called with -X.

# 5 Troubleshooting

#### 5.1 Logfile

Each module records all important events, such as errors, in a file called log.txt in the targetdir. If the output does not look as expected, this file might be worth a look. Note, however, that this file is overwritten if subsequent modules are run one after another (e.g., first ExtractBasisElements and then ExtractSpace).

#### 5.2 "Class def not found" when running one of the bin scripts

You need to run the makefile first (make).

#### 5.3 Memory trouble: "Invalid maximum heap size" or "Out of memory"

Java requires that the heap size is specified when the VM is started. This means that I needed to fix the heap size to some constant; I picked 1 GB for all classes that are called from the command line. Depending on your circumstances, this may be too little or too much.

• If you have a machine with 1 GB memory or less, you will likely see a "could not allocate memory" error.

• On the other hand, if you try to compute a huge space, you will likely see an "out of memory" error when DEPENDENCY VECTORS attempts to allocate space for its data structures.

You can change the heap size with the compiler switch -Xmx<size>. The easiest way to do that is to change the java -Xmx1G statement in the bash scripts in bin, e.g. to java -Xmx500m (less memory) or to java -Xmx5G (more memory). A final complication is that programs of such sizes run into the limitations of 32-bit memory addressing. 32-bit Java can usually deal with heap spaces up to around 1.6GB, but not more. Thus, if you need to compute larger spaces, you will either need to split the target words into multiple batches, find a 64-bit machine with 64-bit Java to use, or implement more memory-efficient data structures.

## 5.4 Further bugs

It is entirely possible that there are still bugs in the system. If you encounter one, please let me know, and I will try to fix it. (Note that fixing bugs is easier and faster the more detailed the error report; it would be optimal if you could send me a "minimal example").

Note that Vector Spaces computed with one parameter setting are not guaranteed to be interpretable with different settings, so if weird errors occur, first make sure that you haven't modified the parameters between two runs.

## 6 Version history

- Version 1.0 (September 2002): First version.
- Version 1.1 (July 2003)
  - New feature: LLT for log-likelihood transformation.
  - New feature: Support for MINIPAR "full parses" format.
  - Doc: First PS documentation.
- Version 2.0 (November 2004)
  - Doc: Thorough documentation of code.
  - Doc: Revised PS documentation.
  - Implementation: Complete refactorisation of classes.
  - Implementation: All programs use targetdir now.
  - Implementation: Introduction of packaging scheme and Makefile.
- Version 2.1 (May 2007)
  - Doc: revised documentation
  - Implementation: Administration of command line arguments centralised
  - FrequencyList and SemanticSpaceArray debugged.
  - LLT debugged.

- Version 2.1a (July 2007)
  - Minor debugging.
  - Added usage sample.
- Version 2.2 (August 2007)
  - More general recognition of the triples vs. full MINIPAR format
  - More general handling of lemmas
- Version 2.3 (January 2008)
  - Bugfixes (handling of antecedents; handling of default context specification)
- Version 2.3a (March 2008)
  - More bugfixes (handling of brittle log transformation)
- Version 2.4 (July 2008)
  - Two bugfixes in triple format reader (thanks to Bram Vandekerckhove)
  - Principled handling of multiple edges in triple format
  - Move to Java 5
  - Modular specification of basis mapping function
- Version 2.4a (December 2009)
  - Refactorization of the Corpus code to improve extensibility
  - Refactorization of the package structure
- Version 2.5 (October 2010)
  - Support for Clark and Curran parser
  - Inclusion of subject/object only context specification
- Version 2.6 (March 2013)
  - Support for the Spanish/Catalan FreeLing parser (courtesy of Raquel G. Alhama)

# References

- [1] S. Pado and M. Lapata: Constructing Semantic Space Models from Parsed Corpora. Proceedings of ACL, Sapporo, 2003.
- [2] S. Pado and M. Lapata: Dependency-based semantic space models. Computational Linguistics 33(2), 161-199. 2007.