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THEME 3
Information and Communication Technologies

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Platform for Automatic, Normalized Annotation and
Cost-Effective Acquisition
of Language Resources for Human Language Technologies

D8.2: Tool-based Evaluation of the PANACEA Production Chain

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Relevant PANACEA Deliverables

| | |
|-------------|--|
| D3.4 | Third version of the Platform |
| D4.1 | Technologies and tools for corpus creation, normalization and annotation |
| D4.5 | Final prototype of the Corpus Acquisition and Annotation Subsystem |
| D5.2 | Aligners Integrated into the Platform |
| D5.4 | Bilingual Dictionary Extractor |
| D7.4 | Third Evaluation Report |

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1 Introduction

After the end of the third evaluation cycle, the PANACEA project launched a final work package, dealing with the evaluation of the PANACEA results in industrial contexts. One focus was the usability of the tools in larger practical setups. A given domain (health & safety) and a given language direction (Italian to German) were investigated, and all tools involved from crawling to bilingual lexicon generation were applied.

The main evaluation criterion was usability in industrial contexts; this comprises robustness, effort, and achieved quality of the single tools in comparison with other (state-of-the-art) tools; detailed evaluation was already done in the development cycles, and should not be repeated here.

2 Task Description

The task of ‘tool-based evaluation’ of the PANACEA tools will look at the single tools to be used in a workflow, in our case domain-adaptation of Machine Translation systems, and look at their quality, and workflow integration. The overall goal in the package ‘Industrial Evaluation’ is to find out how close the components of the PANACEA toolbox are to usability in real situations of industrial production.

It was agreed to use:

- as domain: Health&Safety / Arbeitsschutz / sicurezza sul lavoro, with a focus on the subdomain of construction industry
- as languages: Italian to German

The processing chain to be evaluated, and the evaluation steps, is shown in Fig. 2-1.

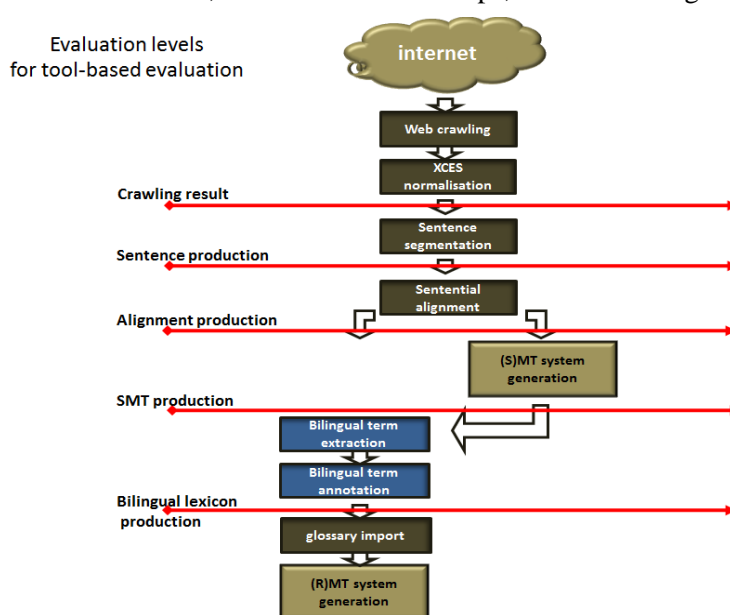


Fig. 2-1: Evaluation levels

Tool-based evaluation will have a closer look on the output of the following components:

- Bilingual crawler. The **crawling result** determines all following steps
- Sentence segmentation and alignment. A list of aligned sentences is what remains from the text preparation results.
- Machine Translation system. We want to assess the quality that can be expected from SMT production.
- Lexicon Extraction. We want to know how useful the bilingual lexicon resulting from this activity really is.

3 Crawling

For crawling, the ILSP Focused Bilingual Crawler was used. Due to temporal restrictions when running the crawler as a web service, it was decided that ILSP would run the crawler themselves.

3.1 Crawler preparation

The crawler needs as input: a list of seed URLs, and a list of seed terms for the topic identifier.

For seed URL collection, to crawl documents in this domain, URLs have been collected pointing to both parallel and monolingual sites. The source of the parallel URLs is mainly:

- European / International (EURLex, OSHA, ILO)
- Swiss (ECAS, SGAS)
- Italian / Regione di Bolzano

Some monolingual sites are added as well, based on the dmoz directory.

For seed term creation, we mainly used a glossary provided by the province of Bolzano, enriched by Eurovoc terms and by terms extracted from en-it and en-de lexicons available at Linguatic.

Both seed URLs and seed terms are given in the Annex.

3.2 Crawler results

For the acquisition process we used a revised version¹ of the Focused Bilingual Crawler developed in WP4. To guide the FBC, we make use of the following resources provided by Linguatic: i) a bilingual topic definition, which was the union of the monolingual topic definitions and ii) the seed URLs of bilingual websites (see the data in the Annex).

After crawling the seed multilingual web sites, the web documents that were relevant to the domain (Health&Safety / Arbeitsschutz / sicurezza sul lavoro) and in the targeted languages (DE, IT) were stored at the nlp.ilsp.gr server. Then, for each selected document, the downloaded HTML file was extracted and the corresponding CesDoc file was created. The next step involved the detection and removal of duplicates. After this stage, the pair detection module examined a) the links to images included in the HTML source and b) the structure of the files to identify pairs of parallel documents.

For each detected pair, a CesAlign file was created, with links pointing to the corresponding CesDoc files. The final output of the FBC is a list of links pointing to the CesAlign files.

The following Table presents the web sites from which the 807 pairs of documents were acquired and the output list for each crawl job.

| Website | # of pairs | Output |
|--|------------|---|
| http://eur-lex.europa.eu | 60 | http://nlp.ilsp.gr/soaplab2-results/output_eur-lex_list.txt |
| http://osha.europa.eu/ | 254 | http://nlp.ilsp.gr/soaplab2-results/output_osha-europa_list.txt |
| http://wegleitung.ekas.ch and http://guida.cfsi.ch | 1 | http://nlp.ilsp.gr/soaplab2-results/output_wegleguida_list.txt |
| http://www.assoimprenditori.bz.it | 4 | http://nlp.ilsp.gr/soaplab2-results/output_assoimprend_list.txt |

¹ The main enhancements concern i) the introduction of an additional method for pair detection based on the links and filenames of the images included in the HTML source and ii) the required modification of the FBC in order to visit two websites (e.g. <http://www.provincia.bz.it> and <http://www.provinz.bz.it>) instead of “staying” in and crawling only one multilingual website

| | | |
|--|-----|---|
| http://www.ekas.admin.ch | 13 | http://nlp.ilsp.gr/soaplab2-results/output_ekas-admin_list.txt |
| http://www.entsendung.admin.ch | 8 | http://nlp.ilsp.gr/soaplab2-results/output_entsendung-admin_list.txt |
| http://www.ilo.org | 2 | http://nlp.ilsp.gr/soaplab2-results/output_ilo_list.txt |
| http://www.provincia.bz.it and http://www.provinz.bz.it | 232 | http://nlp.ilsp.gr/soaplab2-results/output_provin_list.txt |
| http://www.sicuro.ch | 1 | http://nlp.ilsp.gr/soaplab2-results/output_sicuro_list.txt |
| http://www.ssst.ch/ | 3 | http://nlp.ilsp.gr/soaplab2-results/output_ssst_list.txt |
| http://www.suva.ch | 229 | http://nlp.ilsp.gr/soaplab2-results/output_suva_list.txt |

Table 3-1: Crawling Result

Overall, the crawler delivered about 1600 documents of the health & safety domain, about 800 document pairs, containing 1.40 million tokens in Italian, and 1.21 million tokens in German.

3.3 Crawler performance Evaluation

For easier processing, the crawler output file structures were adapted, and unique single filenames were created.

3.3.1 Evaluation questions

The crawler used in the evaluation has four functions; each of them was inspected.

1. Parallelism: It looks for parallel documents in the web. While it is hard to talk about recall (esp. how many parallel documents were missed), however, it can be evaluated if the resulting documents are parallel or not. So the question was: How many documents were parallel / somewhat parallel (i.e. more than 20% of the text is parallel) / not parallel?

2. Topic Identification: As the crawler is a focused crawler, it is relevant how accurate the topic detection of the crawler is. The selected topic was Health&Safety, with a focus of H&S in the construction industry. The question was: How many documents fit to the domain / fit at least partially / do not fit = have a different topic?

3. Language Identification: The crawler determines the language of a document, and marks out-of-language paragraphs. The question was how many paragraphs (textual, not boilerplate) have correct language identification (correctly/incorrectly marked as ‚ool‘, or correctly/incorrectly not marked as ‚ool‘).

4. Boilerplate identification: The crawler marks boilerplates, i.e. document parts which do not belong to the text flow. The question is: How many ‚good‘ texts disappear in boilerplates, and how many ‚bad‘ texts stay in the text flow?

3.3.2 Evaluation Data

Of the 800 document pairs, 100 were randomly selected for manual inspection, coming from all crawled directories. One evaluator was given the task, so there may be slight modifications in the numbers as there are always unclear cases.

Evaluation was supported by a modification of the XCES style sheet, provided by ILSP, so the different kinds of paragraphs (boilerplates, ooi, ool etc.) were marked in different colours; this made the evaluation much simpler.

3.3.3 Evaluation Results

1. Evaluation of parallelism

As mentioned, it could not be evaluated how many parallel documents were *not* found by the crawler. For the ones found, results are given in Table 3-2.

| no documents evaluated | 103 | |
|------------------------|-----|-------|
| parallel | 94 | 91,2% |
| parallel parts | 5 | 4,8% |
| nonparallel | 4 | 3,8% |

Table 3-2: Parallelism

This shows that the crawler returns sufficiently good material for further processing (about 95% of the crawled data are usable for building parallel resources).

Of course the results depend on the quality of the seed URLs provided by the system user; finding good parallel URLs is not a completely simple task.

2. Evaluation of domain specificity

Next, the topic information returned by the crawler was inspected, both on the Italian and the German side. The result is given in Table 3-3.

| language | it | | de | |
|---|-----|-------|-----|-------|
| no documents evaluated | 103 | | 103 | |
| domain-specific (fully or partially) | 79 | 76,6% | 80 | 77.6% |
| irrelevant | 24 | 23,3% | 23 | 22,3% |

Table 3-3: Domain specificity

Reported results of topic identification in industrial contexts sometimes score higher; however they neglect a main factor of influence, namely the distance between training data and recognition data. In ‘real world’, scores between 75% and 85% are realistic to assume, with the current results scoring at 77% for at least partially relevant documents.

It should be mentioned that the quality of topic identification strongly depends on the quality of the seed terms; by inspecting the results, modifying the seed terms, and re-crawling results still could be improved.

3. Evaluation of language identification

As errors, only misinterpretation in ‘good’ paragraphs (no crawlinfo attribute) were counted:

- language different from the one taken as default
- language claimed to be different but is not (or is recognised wrongly)

Results are given in Table 3-4.

| language | it | de |
|--|------|------|
| no errors in Lang. Identification | 13 | 65 |
| total no ‘good’ paragraphs | 5210 | 4749 |

| | | |
|-------------------|--------|--------|
| percentage | 99,75% | 98,63% |
|-------------------|--------|--------|

Table 3-4: Language Identification

80% of the errors were found in one single document (eurlex-212 (de) / eurlex-213 (it)); without it, figures would be even better (99,67% for de and 99,95% for it). The eurlex-212/213 document contains a lot of chemical substances which are difficult to assign a single language to. The rest of errors is mainly due to paragraphs containing several languages within themselves.

4. Errors of boilerplate recognition

Boilerplate treatment was evaluated as well. The main difference was made between ‚good‘ and ‚bad‘ paragraphs, i.e. paragraphs with and without a ‚crawlinfo‘ attribute. Errors were counted if

- a ‚good‘ text part was marked as boilerplate, or if
- a boilerplate content was found in the ‚good‘ text, i.e. was not recognised.

Also, cases were evaluated where a boilerplate in one language was considered a non-boilerplate in the other language (which will create problems in alignment).

Results are given in the Table 3-5. Again, 100 documents per language were inspected.

| language | it | de |
|--|--------|--------|
| total number of paragraphs | 23178 | 23176 |
| wrong boilerplates | 2326 | 2591 |
| percentage of correct recognition | 89,96% | 88,82% |

Table 3-5: ‚Boilerplate‘ removal

Basically the error rate here is about 10%. It should be noted that there are different strategies for boilerplate removal which can be followed in treating the texts:

- One option is to remove everything which does *not* belong to the *text* (HTML information around the real text); this is the ‚classical‘ boilerplate approach.
- Another option is to remove everything which is irrelevant for MT sentence alignment; this goes beyond the first approach as it also removes short text chunks, copyright issues and other paragraphs.

The errors in this section are mainly due to this difference; i.e. if the text itself contains paragraphs which are not usable for MT alignment.

It should be noted that the crawler has different ‚crawlinfo‘ values to cope with this problem: The ‚boilerplate‘ value is set if a classical boilerplate chunk is identified². The other values, ‚out-of-language‘, and in particular ‚out-of-length‘, give the users the option to integrate the respective texts into the ‚good‘ text section or not. In the current tests, they had been excluded, which may not be the best option if the complete text flow is to be kept (e.g. for indexing or information extraction purposes).

In particular the out-of-length attribute has a critical influence here: It causes text parts like headings, or some enumeration / list elements to disappear in the resulting text. It may be worthwhile to reconsider this parameter, esp. if the crawler is to be used for monolingual applications in the information extraction domain.

² following Kohlschütter et al. 2010

3.3.4 Recommendations

Overall, the impression is that the error rates of the different components are low enough to enable the use of the PANACEA Focused Bilingual Crawler in industrial setups; the crawler performance matches industrial usability requirements.

In future versions, improvements of the following kind could be imagined:

- Names like ‘`ekas-admin_f\ae9bfeef-bcac-44d3-a356-c0b4d20e2962\xml\86.html`’ may have a more user-friendly correspondence. Also, in the alignment files, it would help if the order could reflect the source / target language assignment of a document pair.
- Strategy of the topic identifier: Beyond co-occurrence of seed terms, more sophisticated models could be used. This will increase crawling / processing time but may reduce the time needed to inspect and revise the crawled data.
- Boilerplate: The `crawlinfo` values must be considered with care. A strategy where all ‘`crawlinfo`’ segments are removed may be good for the detection of parallel segments; if the extraction of the whole text flow is intended then the text portions marked with the ‘`out-of-length`’ parameter should be kept: In cases where format indicators like `<heading>` or `<list item>` are found, the text should be kept as text, not as boilerplate.
- As will be shown below, a major issue is the treatment of enumerations (1. ... 2. ... 3. or 1.2.1, 1.2.2 and similar ones) in sentence boundary detection. This is a formatting element, and should not come into the text part. A special recogniser would be helpful in such cases, to prevent the enumeration from being interpreted as the first word in the following sentence.

4 Sentence Extraction and Alignment

Once domain-relevant parallel documents are identified, the next step is to extract aligned sentences from them. This task consists of two subtasks: sentence segmentation, and sentence alignment.

4.1 Sentence segmentation

The next step in processing to be looked at is sentence segmentation. In order to assess the quality of some of the PANACEA tools in this area, a standard sentence segmentation module was used, namely the one delivered with the Europarl corpus (www.statmt.org/europarl). It was compared to one of the PANACEA sentence segmentisers, the LT-SSplit segmentiser (cf. D4.5). Both the German and the Italian documents were sentence-segmented with both tools. The results are given in Table 4-1.

| No Segments | it | de |
|------------------|--------|--------|
| Europarl | 44.100 | 37.300 |
| LT-SSplit | 58.900 | 51.600 |
| common | | 22.700 |

Table 4-1: Sentence Segmentation results

It can be seen that the SSplit segmentiser produces significantly more sentences than the Europarl segmentiser; only about half of the sentences are identical. A closer look at the differences was taken as a consequence, by inspecting 1000 sentences in each language. The results of this evaluation are given in Table 4-2.

| (1000 sentences) | it | de |
|--------------------------|-----|-----|
| Europarl correct | 129 | 120 |
| LT-SSplit correct | 353 | 428 |
| both wrong | 518 | 452 |

Table 4-2: Sentence Segmentation Evaluation

The evaluation shows that the PANACEA tool is significantly more accurate than the Europarl segmentiser, in German more than in Italian.

The rather high number of incorrect segmentations results mainly from two phenomena:

- Treatment of enumerations as parts of a sentence, and not as a formal element³
- Interaction of sentence boundaries and paragraph boundaries. While LT-SSplit treats `<p> ... </p>` markups also as sentence boundary, the Europarl segmentiser does not.

In any case, the PANACEA sentence segmentation is clearly competitive in terms of industrial quality. The question is which effect the significant difference in sentence segmentation has on the alignment, as sentences form the basis of alignment.

³ This leads to mistakes when the numbers are treated as ordinals, and the constituents are moved in translation: (de) ‘2. Löwen sehen wir gern’ -> (en) ‘We love to see 2. Lions’

This is considered to be bad writing in handbooks for technical authors, but still occurs frequently in texts.

4.2 Alignment

For alignment, a standard tool provided in the PANACEA toolbox is Hunalign; it was used for the evaluation. Hunalign produces scores for a given alignment; in PANACEA experiments, it has been proven to be the best strategy to take segments with a score higher than 0.4. If this threshold is used, then results as shown in Table 4-3 are obtained:

| No Segments | provided | used | in % |
|-------------|----------|--------|-------|
| Europarl | 37600 | 19.399 | 51.4% |
| LT-SSplit | 52.600 | 28.900 | 54.9% |

Table 4-3: Alignment results

This shows that only about 50% of the texts can really be used for parallel corpora. The results of LT-SSplit are slightly better (by 3%) than the baseline Europarl results. However, even in documents considered as parallel at first, many segments are not usable for parallel training.

To find out how correct the alignment is, 1000 sentence pairs of the resulting corpus have been manually inspected; the results are given in Table 4-4.

| (1000 sentences) | correct | in % | wrong |
|------------------|---------|-------|-------|
| Europarl | 817 | 81,7% | 183 |
| LT-SSplit | 866 | 86,6% | 134 |

Table 4-4: Correctness of alignment

The result is that 15 to 20 out of 100 alignments are incorrect, which may negatively influence the creation of SMT resources. Again, LT-SSplit performs slightly better than Europarl.

Hunalign is a standard tool used in SMT production; in PANACEA there was no work on alignment planned; the tools were just integrated into the toolbox. However, the result shows that there is room for improvement.

5 SMT System

The parallel data produced by the aligners were used as input for in-domain training of a Moses system.

5.1 Preparing Data

The SMT step of the pipeline receives sentence-aligned data (covered in the previous subsection). The data is then tokenised and lowercased using Europarl tools.

The following table give details of the amount of sentences through the preparation process:

- “Provided“ is the amount of sentences output of the aligner without threshold.
- “Unique“ is the amount of sentences after removing duplicate sentence pairs.
- “Clean“ is the amount of sentences after applying the threshold, which removes those sentence alignments with confidence score below 0.4.

“Hns” is the Health&Safety domain, both with europarl (“Hns-europarl”) and SSplit (“Hns-ss”) sentence segmentation. “Aut” is the automotive domain (used in task 8.3).

| Dataset | Provided | Unique | % | Clean | % |
|--------------|----------|--------|--------|---------|------------|
| Hns-europarl | 37,595 | 32,383 | 86.14% | 19,332 | 51.42% |
| Hns-ss | 52,605 | 43,611 | 82.90% | 28,904 | 54.95% |
| Aut | 24,235 | 18,786 | 77.52% | 14,692 | 60.62% |
| WP5 | 13k-35k | | | 10k-24k | 66.5-77.8% |

Table 5-1: Data sets for SMT development

The following table shows the amount of sentences in the development and test datasets. They come from the same dataset and the amount devoted to each set was decided taking into account the findings of Pecina et al., 2012 (more than 500 sentence pairs for development set does not provide a further improvement).

| Dataset | Provided | Dev | Test |
|---------|----------|-----|-------|
| Hns | 2,000 | 500 | 1,500 |
| Aut | 1,501 | 500 | 1,001 |

Table 5-2: Development and test set for Health&Safety and automotive

Finally, the following table provides quantitative details of each of the datasets. For each of them we show the amount of sentences and tokens as well as the vocabulary size.

| Domain | Language | Set | Sentences | Tokens | Vocabulary | Type-token Ratio |
|--------|----------|----------------|-----------|---------|------------|------------------|
| HNS | DE | Train-europarl | 19,332 | 617,269 | 33,546 | 5.43% |
| | | Train-ss | 28,904 | 744,159 | 37,096 | 4.98% |
| | | Dev | 500 | 9,690 | 2,779 | 28.68% |
| | | Test | 1,500 | 27,971 | 5,392 | 19.28% |
| | IT | Train-europarl | 19,332 | 716,751 | 22,155 | 3.09% |
| | | Train-ss | 28,904 | 857,222 | 23,415 | 2.73% |
| | | Dev | 500 | 11,357 | 2,601 | 22.90% |
| | | Test | 1,500 | 32,489 | 4,786 | 14.73% |

Table 5-3: Data Analysis for the Health&Safety domain data

5.2 SMT systems

The MT systems used have been built using Moses (Koehn et al., 2007). For training the systems, training data is tokenized and lowercased using the Europarl tools. The original (non-lowercased) target sides of the parallel data are kept for training the Moses recaser. The lowercased versions of the target sides are used for training an interpolated 5-gram language model with Kneser-Ney discounting using the IRSTLM toolkit (Federico et al. 2011). Translation models are trained on the training corpora (see Section 5.1), lowercased and filtered on sentence level; we kept all sentence pairs having less than 100 words on each side. The maximum length of aligned phrases is set to 7 and the reordering models are generated using parameters: distance, orientation-bidirectional-fe. The model parameters are optimized by Minimum Error Rate Training (Och, 2003) on development sets. For decoding, test sentences are tokenized, lowercased, and translated by the tuned system. Letter casing is then reconstructed by the recaser and extra blank spaces in the tokenized text are removed in order to produce human-readable text.

5.3 Evaluation

The result has been evaluated using automatic metrics as well as human judgement.

5.3.1 Automatic Evaluation

The systems have been evaluated using a set of state-of-the-art automatic metrics, namely BLEU, NIST, TER and GTM. We report also the size of the vocabulary of the test set and the amount of out of vocabulary (OOV) words.

We have a number of systems according to the data used for training and tuning and the sentence aligner used to split this data:

- The system **v0** is trained and tuned on Europarl, considered to be a general-domain corpus. This is the baseline system to which we will compare our domain-specific systems.
- Systems **v1** are trained on the union of Europarl and the domain-specific data and tuned on domain-specific data.
- Finally, systems **v2** are trained and tuned on domain-specific data only.

Regarding the sentence aligner used, we have two sets of systems. Europarl sentence splitter is used for systems Europarl while SSplit is used for systems Ss. Evaluation results are shown in Tab. 5-4.

| | BLEU | Δ% | NIST | Δ% | TER | Δ% | GTM | Δ% | OOV* | % |
|-------------------|--------|---------|--------|--------|--------|---------|--------|--------|------|--------|
| v0 | 0.0729 | 0.00% | 3.0765 | 0.00% | 1.0544 | 0.00% | 0.2659 | 0.00% | 326 | 6.05% |
| v1europarl | 0.1293 | 77.37% | 4.4665 | 45.18% | 0.8221 | -22.03% | 0.3481 | 30.92% | 196 | 3.64% |
| v1ss | 0.1290 | 76.95% | 4.4681 | 45.23% | 0.8305 | -21.23% | 0.3464 | 30.30% | 190 | 3.52% |
| v2europarl | 0.0972 | 33.33% | 3.7136 | 20.71% | 0.8694 | -17.55% | 0.3008 | 13.13% | 1408 | 26.11% |
| v2ss | 0.0981 | 34.57% | 3.7436 | 21.68% | 0.8747 | -17.04% | 0.3028 | 13.89% | 1293 | 23.98% |
| bing | 0.1470 | 101.65% | 4.8343 | 57.14% | 0.7787 | -26.15% | 0.3673 | 38.15% | NA | NA |
| google | 0.1537 | 110.84% | 4.7662 | 54.92% | 0.7940 | -24.69% | 0.3759 | 41.41% | NA | NA |

Table 5-4: Automatic Evaluation Results

5.3.2 Human Evaluation

In order to have a second criterion for the quality of the MT output, human evaluation has been performed. 500 Sentences of the test set were inspected:

- A comparative evaluation (between baseline (v0) and adapted (v1ss) system) was made.
- An absolute evaluation of the adapted (v1ss) system was made.

For evaluation, the COMP and ABS components of the Sisypus-II tool were used; screenshots are given in Fig. 5-1.

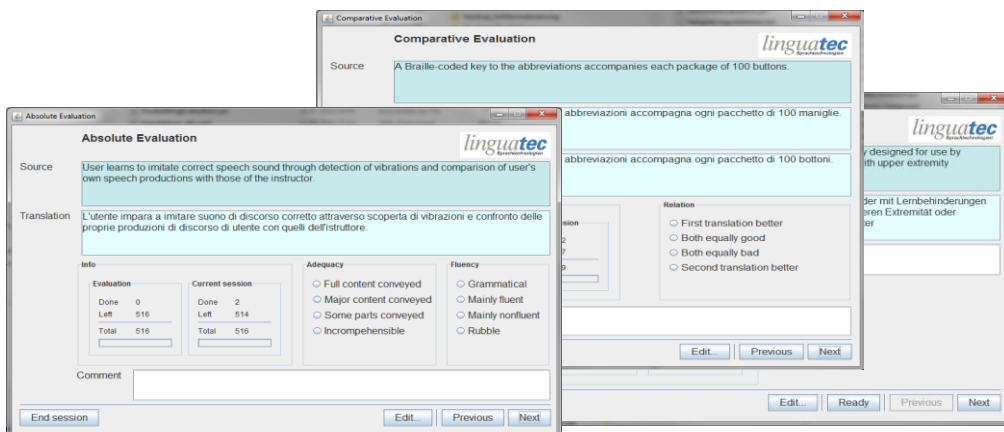


Fig. 5-1: Sisyphos-II evaluation tools

The result of the evaluations is given in Figure 5-2.

Comparative Evaluation showed a 6.13% improvement of the adapted system against the baseline⁴. This is in line with the automatic scores.

Absolute evaluation of the adapted version (v1ss), however, show a rather low MT quality:

- In terms of adequacy (full or major content conveyed), the v1ss system reaches 31.03%
- In terms of fluency (grammatical or mainly fluent), the v1ss system reaches 22.53%

For comparison: In the METAL project, a system was only released when both values were above 70%. In this respect, the MOSES IT-DE system does not meet the release quality.

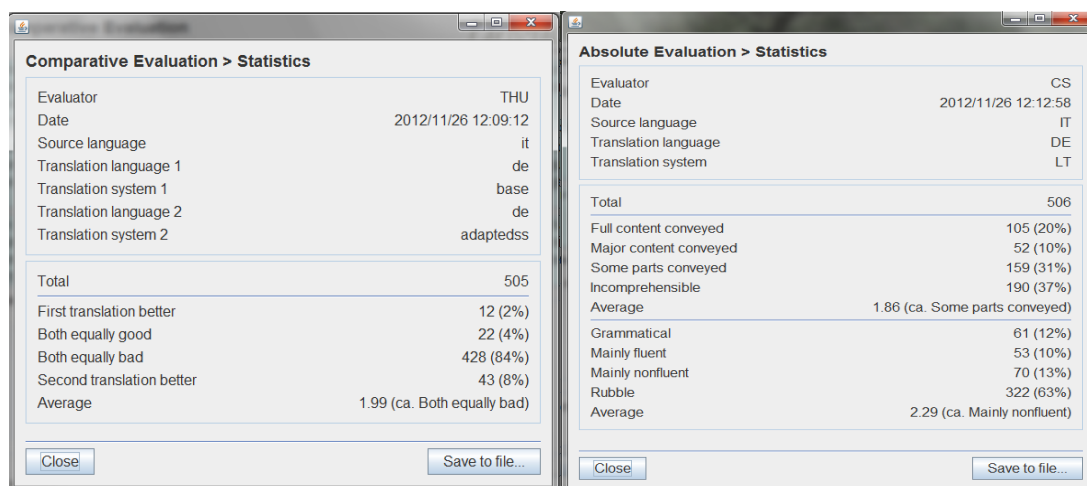


Fig. 5-2: Human evaluation: COMP v0vs. v1ss, ABS-v1ss

However, as times have changed, a comparison with the state-of-the-art system (Google) was made; Google is slightly better in automatic scores (cf. table 5-4 above). So, 100 sentences of the test were evaluated in a comparison between v1ss and the Google output. The result is shown in Fig. 5-3.

⁴ Calculation is: (Improvements – deteriorations) DIV total_sentences



Fig. 5-3: Human evaluation: COMP V1ss vs. Google

It can be seen that the Google state of the art system improves by 21.35%; however the majority of cases (61%) is still evaluated negative (both equally bad). So the state-of-the-art system it is not significantly better than the PANACEA system. This is also reflected in the automatic scores.

The complete evaluation result is given in Fig. 5-4, comparing v0 and v1 ss.

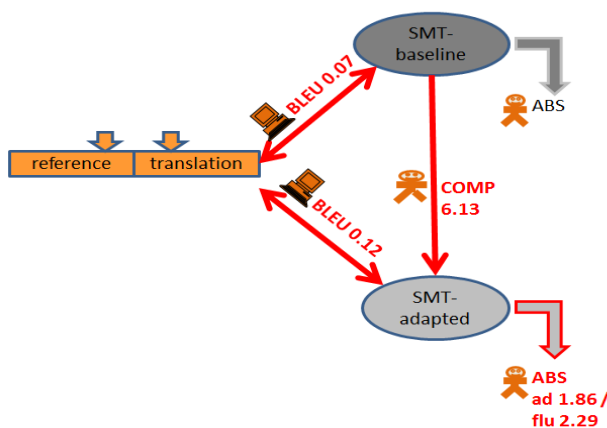


Fig. 5-4: SMT Evaluation results

6 Glossary Production

The last interface to be tested is the output of the glossary production, and the quality of the bilingual lexicon.

The data for evaluation were created with the PANACEA tool LT-P2G, which builds term lists and glossaries from phrase tables.

Two evaluations were made, one for the version v2ss (only in-domain data), and one for the full version (v1ss, containing baseline plus in-domain data).

6.1 Evaluation of v2 data (in-domain only)

As input for this experiment, the phrase table created by the version v2ss was taken; this system contained in-domain data only. The phrase table size is about 1.5 million entries.

To investigate what the best translation probability threshold would be, three runs were made (with $P(t|s)=0.6$, $P(t|s)=0.5$, and $P(t|s)=0.4$). Overall about 3000 entries were extracted from the phrase table data. Table 6-1 shows the result.

| Prob. | $P(t s) > 0.6$ | in % | $0.6 > P(t s) > 0.5$ | in % | $0.5 > P(t s) > 0.4$ | in % |
|----------------------|----------------|--------------|----------------------|-------|----------------------|-------|
| total entries | 959 | | 1944 | | 158 | |
| Moses errors | 181 | 18.8% | 1029 | 52.9% | 32 | 20.2% |
| P2G errors | 21 | 2.2% | 15 | 0.8% | 0 | 0.0% |
| total errors | 202 | 21.0% | 1044 | 53.7% | 32 | 20.2% |

Table 6-1: Evaluation of in-domain data

The results show that the restricted quality of the SMT phrase table also influences the glossary extraction component; vice versa the glossary extraction quality depends quite substantially on the quality of the phrase tables. While the P2G error rates are remarkable (less than 2%), an overall error rate of 53.7% for $P(t|s)=0.5$ is definitely not acceptable in industrial contexts, as every second term candidate would have to be corrected. Even if the threshold is left at $P(t|s)=0.6$, the error rate is still 21.0%, which is significantly higher than in the development experiments.

Next, it was investigated which effect it has to also look at the reverse translation probability. This is shown in tab. 6-2.

| Prob. | $P(t s) > 0.6$ && $P(s t) > 0.6$ | in % |
|----------------------|-------------------------------------|--------------|
| total entries | 536 | |
| Moses errors | 69 | 12.9% |
| P2G errors | 9 | 1.7% |
| total errors | 78 | 14.5% |

Table 6-2: Evaluation of in-domain data: Bidirectional probabilities

It can be seen that the error rate drops by a third, and many incorrect term pairs are filtered out; however the recall is only about half of the recall in the first run. For automatic lexicon production, recall is less important than precision, if no human validation step is included.

6.2 Evaluation of the v1 data (full dataset)

The second evaluation was based on the full data set (version v1ss). The phrase table here contains 104.6 million entries. The run with a basic $P(t|s)=0.6$ threshold produced a glossary of about 28,300 entries.

Of these, two subsets were manually evaluated:

- a random selection of entries (every tenth entry): 2830 overall
- a selection of only single word entries, 3568 overall

Evaluation results are given in table 6-3.

| | every_tenth | | single_words | | total | |
|---------------|-------------|-------|--------------|-------|-------|-------|
| total entries | 2830 | in % | 3578 | in % | 6408 | in % |
| Moses errors | 448 | 15,83 | 228 | 6,37 | 676 | 10,55 |
| P2G errors | 72 | 2,54 | 189 | 5,28 | 261 | 4,07 |
| total errors | 520 | 18,37 | 417 | 11,65 | 937 | 14,62 |

Table 6-3: Evaluation of the full data set

The evaluation shows that the term extraction for the full data set gives better results than for the in-domain data only. After evaluation of about 25% of the result, the error rate comes to 14.6%.

This is still higher than the results during the tests (which had an avg error rate of 9.26%⁵), the main reason being the phrase alignment quality⁶: Higher BLEU scores (as achieved in the data used for component tests, mainly involving English) also produce better glossaries. Lower BLEU scores (in non-English-including directions) reduce the glossary quality.

Although correct term creation in about 85% of the cases still requires manual validation, the overall effort for lexicon production drops substantially, as such a validation is much faster than conventional procedures, as only incorrect proposals need to be deleted to end up with a usable glossary.

6.3 PANACEA It-De-Glossary

From the evaluated data (both v1 and v2), the ‘good’ entries were merged, duplicates were removed, and a POS-annotated, human-validated term list was produced. It contains about 6700 entries.

⁵ it should be noted, however, that in tests, Italian-English had already the highest error rate (14.4%), which is close to the figure above.

⁶ The high rate of P2G errors in the single word evaluation comes mainly from capitalisation errors in Italian (incorrect lemma of proper names like Assisi etc.)

7 References

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8 Annex: Crawler Data

8.1 Seed Terms DE

(special files with proper crawler input format have been prepared)

| | | |
|---------------------------|---------------------------|--------------------------|
| Abbrucharbeiten | Auslösewert | Einsatzsicherheitsplan |
| Abbruchprogramm | Bauauftrag | Elektroanlage |
| Abriss | Baugewerbe | erbgutverändernder |
| Absturzgefahr | Baugewerbe | Arbeitsstoff |
| Absturzsicherung | Bauherr | Erdungsanlage |
| Allgemeine | Bauindustrie | Ernste und unmittelbare |
| Schutzmaßnahme | Bauindustrie | Gefahr |
| Anordnung | Bauleiter | ESP |
| Anstalt für Arbeitsschutz | Bauphase | Explosionsfähige |
| Arbeitsaufsicht | Bauprodukt | Atmosphären |
| Arbeitsauftrag | Bauprojekt | Explosionsschutzdokument |
| Arbeitsbedingungen | Bauprozess | Expositionsgrenzwert |
| Arbeitsbedingungen | Baustelle | Expositionsregister |
| Arbeitsbühne | Baustelle | Fahrbare Leiter |
| Arbeitsgang | Baustellenlogistik | Festigkeitsberechnung |
| Arbeitsmittel | Baustellenrichtlinie | Fluchtweg |
| Arbeitsorganisation | Bauunternehmen | Gebäude |
| Arbeitsplatzgrenzwert | Bauunternehmer | Gefahr |
| Arbeitsraum | Bauwesen | Gefährdung |
| Arbeitsschutz | Bemessungsblatt | Gefahrenbereich |
| Arbeitsschutzbestimmung | Berufsgenossenschaft | Gefahrenbeurteilung |
| Arbeitsschutzdienst | Berufsunfall | gefährlich |
| Arbeitsseil | Berufsunfälle | Gefahrstoffe |
| Arbeitssicherheit | Berufsverband | Gerichtsbericht |
| Arbeitsstätte | Biologische Überwachung | Gerüst |
| Arbeitsstoff | Biologischer Arbeitsstoff | Gerüstbelag |
| Arbeitsunfall | Biologischer | Gerüstlage |
| Arbeitsunfallversicherung | Arbeitsstofftoleranzwert | Gesamtstaatliche |
| Arbeitsverfahren | Biologischer Grenzwert | Beratungskommission für |
| Ärztliche Untersuchung | Blitzschutzanlage | Toxikologie |
| Atemschutzgerät | Brüstung | Gesetzesverletzung im |
| Auflagefläche | CE-Kennzeichnung | Sachbereich der |
| Aufsichtsorgan | Chemischer Arbeitsstoff | Arbeitssicherheit |
| Auftragnehmer | Dachdecker | Gesetzlicher Vertreter |
| | | Gesundheitsministerium |

| | | |
|------------------------------------|---|---|
| Gesundheitsschutz am Arbeitsplatz | Notfall | Seitenschutzgeländer |
| Gesundheitsüberwachung | Oberer Auslösewert | Selbstsicherndes System |
| Gewerkschaftsbeziehungen | Pausenraum | Selbstständige |
| Gleichwertiger Sicherheitsstand | Periodische Arbeitsschutzsitzung | sichere Instandhaltung |
| Gleitschutzvorrichtung | Periodische Überprüfung | Sicherer Ort |
| Grenzwert | Persönliche Schutzausrüstung | Sicherheits- und Koordinierungsplan |
| händisches Bewegen von Lasten | Persönlicher Gehörschutz | Sicherheits-, Anzeige- oder Kontrollvorrichtungen |
| Hängeleiter | Physikalische Einwirkung | Sicherheitsaudit |
| Hersteller | PiMUS | Sicherheitsausrüstung |
| Höhenarbeiten | Plan für Aufbau, Benutzung und Abbau von Gerüsten | Sicherheitsbeauftragte Arbeitnehmervertreter |
| Hygienemaßnahme | Produktionseinheit | Sicherheitsfachkraft |
| Impulsförmiger Schall | Projektant | Sicherheitsgeschirr |
| Individueller Gefahrenschutz | PSA | Sicherheitskoordinator in der Ausführungsphase |
| Karzinogen | Regeln der Technik | Sicherheitskoordinator in der Planungsphase |
| karzinogener Arbeitsstoff | Regelung | Sicherheitsmerkleblatt |
| Kollektiver Gefahrenschutz | Register der Krankheits- und Todesfälle | Sicherheitsrichtlinien |
| Körperschall | Rettungsmaßnahmen | Sicherheitsstandard |
| krebserregender Arbeitsstoff | Richtlinie | Sicherheitsstufe |
| Lärm | Richtlinie | Sicherungsseil |
| Lärmbelästigung | Risiko | SKP |
| Laufsteg | Risikoausschaltung | Spezifische Gefahr |
| Leiter | Risikobeurteilung | Spitzenschalldruck |
| Leiter des Arbeitsschutzdienstes | Risikobewertung | Ständer |
| Lieferung und Montage bzw. Einbau | Risikomappe | Standfestigkeitsberechnung |
| Luftschall | Risikominderung | Ständiger |
| manuelle Handhabung von Lasten | Risikoprävention | Beratungsausschuss für Unfallverhütung und Arbeitshygiene |
| Maschinenrichtlinie | Rollgerüst | Steckleiter |
| Maximale Arbeitsplatzkonzentration | Rollsteig | Strafbestimmungen |
| Mindestinhalt | Ruhezeit | Straftat |
| Mindestvoraussetzungen | Schiebeleiter | Strickleiter |
| Mutagen | Schulung | Tages-Lärmexpositionspegel |
| mutagener Arbeitsstoff | Schutzhelm | Technische und organisatorische Maßnahmen |
| Notabschaltvorrichtung | Schutzkleidung | |
| | Schutzkleidung | |
| | Schutzmaßnahme | |
| | Schutzmaßnahmen | |

| | | |
|---------------------------|---------------------|------------------------------|
| Technischer | Unfalluntersuchung | Vorsicht |
| Arbeitsinspektor | Unfallverhütung | Vorsorgekartei |
| Tragbare Leiter | Unfallverhütung | Wochen- |
| Tragfähigkeit | Unfallverhütung | Lärmexpositionspegel |
| Transportmittel | Unfallversicherung | Zeitlich begrenzte Baustelle |
| Tumorregister | Unterer Auslösewert | Zeitweilige Arbeiten |
| Unfall- und | Verfügung | Zugangsmittel |
| Berufskrankheitenregister | Verletzung an der | Zugangsverfahren |
| Unfallprävention | Lendenwirbelsäule | Zuständige Betriebsarzt |
| Unfallreduzierung | Vorankündigung | Zuständige des |
| Unfallstatistik | Vorschriften | Arbeitsschutzdienstes |

8.2 Seed Terms IT: Sicurezza sul lavoro

| | | |
|--|--|--|
| Accertamento sanitario | Commissione consultiva permanente per la prevenzione degli infortuni e l'igiene del lavoro | Dispositivo antiscivolo |
| Addetto al servizio di prevenzione e protezione dai rischi | Commissione consultiva tossicologica nazionale | Dispositivo di arresto di emergenza |
| Agente | Committente | Dispositivo di protezione contro le cadute (dall'alto) |
| Agente biologico | condizioni di lavoro | Dispositivo di protezione delle vie respiratorie |
| Agente cancerogeno | Contenuto minimo | Disposizione |
| Agente chimico | Contratto d'opera | disposizione |
| Agente fisico | Coordinatore della sicurezza per l'esecuzione | Documento sulla protezione contro le esplosioni |
| Agente mutageno | Coordinatore della sicurezza per la progettazione | DPI |
| assicurazione infortuni sul lavoro | costo degli infortuni | edilizia |
| Atmosfere esplosive | costo di lesioni | edilizia dei trasporti |
| attività di costruzione | costo di malattia | Elemento di appoggio |
| Attrezzatura di lavoro | costruttore | Eliminazione dei rischi |
| Calcolo di resistenza | Direttiva | Emergenza |
| Calcolo di stabilità | Direttiva cantieri | equipaggiamento di protezione |
| Cantiere | Direttiva macchine | Esperto della sicurezza |
| cantiere edile | Direttore dei lavori | Fabbricante |
| cantiere edile | Dispositivi di protezione individuale | falegnameria |
| Cantiere temporaneo | Dispositivi di sicurezza o di segnalazione o di controllo | fase di costruzione |
| Capacità portante | | Fase di lavoro |
| Cartella sanitaria e di rischio | | Formazione |
| casco protettivo | | |
| cautela | | |

| | | |
|--|--|---|
| Fornitura e posa in opera | Locale di riposo | piano di posa |
| Fune di lavoro | Luogo di lavoro | Piano di sicurezza e di coordinamento |
| Fune di sicurezza | Luogo sicuro | Piano operativo di sicurezza |
| Imbracatura di sostegno | manutenzione degli edifici | Piattaforma |
| Impalcato | manutenzione sicura | PiMUS |
| Impianto di protezione contro le scariche atmosferiche | Mappa di rischio | ponteggio |
| Impianto di terra | Marcatura CE | ponteggio su ruote |
| Impianto elettrico | Marciapiede mobile | POS |
| Impresa appaltatrice | materia di sicurezza | prescrizione |
| impresa edile | Medico competente | Prescrizione |
| Inchiesta infortunio | Mezzi di trasporto | Pressione acustica di picco |
| incidente sul lavoro | Ministero della sanità | prevenzione |
| indumenti di protezione | Misura generale di tutela | prevenzione degli infortuni |
| Indumento protettivo | Misura igienica | Prevenzione degli infortuni |
| industria edile | Misure di emergenza | Procedura di lavoro |
| industria edilizia | Misure di prevenzione | processo di costruzione |
| infortunio sul lavoro | Misure di protezione collettiva | Produttore |
| ingegneria civile | Misure di protezione individuale | Progettista |
| Inquinamento acustico | misure di salvaguardia | progetto di costruzione |
| Ispettore tecnico del lavoro | Misure tecniche ed organizzative | progetto edile |
| Istituto Superiore Prevenzione e Sicurezza sul Lavoro (ISPESL) | Monitoraggio biologico | Programma di demolizione |
| lavoratore del settore edile | morte bianca | Protezione individuale dell'udito |
| Lavoratore/trice autonomo/a | Movimentazione manuale dei carichi | protezione individuale durante il lavoro |
| Lavori in quota | Norma di tutela del lavoro | PSC |
| Lavori temporanei | Norme di buona tecnica | Rapporto giudiziario |
| lavoro di costruzione | Norme penali | Rappresentante dei lavoratori per la sicurezza |
| Legale rappresentante | Notifica preliminare | Reato |
| Lesione dorso-lombare | Organo di vigilanza | Registro degli infortuni e malattie professionali |
| Linee guida | Parapetto | Registro dei casi di malattia e di decesso |
| Livello di contenimento | Passerella | Registro dei tumori |
| Livello di esposizione giornaliera al rumore | Pericolo | Registro di esposizione |
| Livello di esposizione settimanale al rumore | Pericolo grave ed immediato pericoloso | regolamento |
| Livello di sicurezza equivalente | Periodo di riposo | Relazione di calcolo |
| Locale di lavoro | Piano di calpestio | Relazioni sindacali |
| | Piano di montaggio, uso e smontaggio di ponteggi | Requisiti minimi |

| | |
|--|---|
| Responsabile del servizio di prevenzione e protezione | Uso di attrezzature munite di videoterminali |
| Riduzione dei rischi | Valore di azione |
| Rischio | Valore inferiore di azione |
| Rischio di caduta dall'alto | Valore limite |
| Rischio specifico | Valore limite biologico |
| Riunione periodica di prevenzione e protezione dai rischi | Valore limite di esposizione professionale |
| RLS | Valore superiore di azione |
| RSPP | Valutazione del rischio |
| Rumore | Verifica periodica |
| Rumore impulsivo | Via di emergenza |
| Rumore strutturale | Violazione in materia di sicurezza del lavoro |
| Rumore trasmesso per via aerea | Zona pericolosa |
| sanita del lavoro | |
| Scala a funi | |
| Scala a pioli | |
| Scala a pioli composta da più elementi innestabili | |
| Scala a pioli mobile | |
| Scala a pioli sospesa | |
| Scala a piolo portatile | |
| Scala a sfilo | |
| Scheda dei dati di sicurezza | |
| Servizio di prevenzione e protezione dai rischi settore edilizio | |
| sicurezza per il settore edile | |
| Sicurezza sul lavoro | |
| Sistema autobloccante | |
| Sistema di accesso situazione pericolosa | |
| Sorveglianza sanitaria sostanza pericolosa | |
| statistica sugli incidenti | |
| Superficie di appoggio | |
| Trabattello | |
| Unità produttiva | |

8.3 Seed URLs DE

(first part are parallel URLs)

<http://eur-lex.europa.eu>
<http://de.wikipedia.org/wiki/Arbeitsschutz>
http://eur-lex.europa.eu/smartapi/cgi/sga_doc?smartapi!celexapi!prod!CELEXnumdoc&lg=de&numdoc=31989L0686&model=guichett
<http://eur-lex.europa.eu/LexUriServ/LexUriServ.do?uri=CELEX:31989L0656:DE:HTML>
<http://osha.europa.eu/de>
<http://www.ekas.admin.ch/index-de.php>
<http://www.ilo.org>
<https://experts.tis.bz.it>
http://www.entsendung.admin.ch/cms/content/lohn/arbeitssicherheit_de/
<http://www.sgas.ch>
<http://wegleitung.ekas.ch>
<http://www.issa.int>
<http://www.sicuro.ch>
<http://newsletter-vslzh.ch/index.php?id=116&L=2>
<http://www.ssst.ch/de/>
<http://www.b-f-a.ch/de/index.asp>
<http://www.arbeitssicherheitschweiz.ch>
<http://www.suva.ch/startseite-suva/praevention-suva/arbeit-suva.htm>
<http://www.provinz.bz.it/arbeit/arbeitsschutz/172.asp>
<http://www.ingbz.it/content.asp?L=2&IDMEN=182>
<http://www.assoimpreditori.bz.it/bolzano/notiziario/istituzionale.nsf/codice/576-762?opendocument&lan=de>

<http://www.bgbau.de>
<http://www.dguv.de/inhalt/index.jsp>
http://www.inail.it/Portale/appmanager/portale/desktop?_nfpb=true&_pageLabel=PAGE_HOME_DD

8.4 Seed URLs IT

(first part are parallel)

<http://eur-lex.europa.eu>
http://it.wikipedia.org/wiki/Sicurezza_sul_lavoro

http://eur-lex.europa.eu/smartapi/cgi/sga_doc?smartapi!celexapi!prod!CELEXnumdoc&lg=de&numdoc=31989L0686&model=guichett
<http://eur-lex.europa.eu/LexUriServ/LexUriServ.do?uri=CELEX:31989L0656:IT:HTML>
<http://osha.europa.eu/it>
<http://www.ekas.admin.ch/index-it.php>
<http://www.ilo.org>
<https://experts.tis.bz.it>
http://www.entsendung.admin.ch/cms/content/lohn/arbeitsicherheit_it/
<http://www.sgas.ch>
<http://wegleitung.ekas.ch>
<http://www.issa.int>
<http://www.sicuro.ch>
<http://newsletter-vslzh.ch/index.php?id=116&L=2>
<http://www.ssst.ch/it/>
<http://www.b-f-a.ch/it/index.asp>
<http://www.arbeitssicherheitschweiz.ch>
<http://www.suva.ch/it/startseite-suva/praevention-suva/arbeit-suva.htm>
<http://www.provincia.bz.it/lavoro/tutela-del-lavoro/172.asp>
<http://www.ingbz.it/content.asp?L=1&IdMen=182>
<http://www.assoimprenditori.bz.it/bolzano/notiziario/istituzionale.nsf/codice/576-762?opendocument&lan=it>

<http://www.lavoro.gov.it/Lavoro/SicurezzaLavoro/>
<http://www.amsicurezzasullavoro.it/>
<http://www.ispesl.it/>
<http://www.intrage.it/rubriche/lavoro/sicurezza/index.shtml>
<http://www.aifos.eu/>
http://it.wikipedia.org/wiki/Testo_unico_sulla_sicurezza_sul_lavoro

8.5 Glossary used:

http://www.provinz.bz.it/arbeit/download/Begriffe_zur_Arbeitssicherheit_12-11-07dt-it.pdf