Open-source Portuguese–Spanish machine translation

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#### Contents

- The Apertium MT toolbox
  - Background
  - Rationale
  - Why open source?
  - The Apertium architecture
  - Modules
- Linguistic data for the Portuguese–Spanish pair
  - Lexical data
  - Lexical disambiguation data
  - Structural transfer rules
  - Post-generation data
  - A quick evaluation
- 3 Concluding remarks

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Background Rationale Why open source? The Apertium architecture Modules

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Apertium is based on the technologies developed by the Transducens group at the Universitat d'Alacant during the development of two existing systems:

- interNOSTRUM (interNOSTRUM.com, Spanish-Catalan)
- Tradutor Universia (tradutor.universia.net, Spanish-Portuguese)

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# Rationale /1

To generate translations which are

- reasonably intelligible and
- easy to correct

between related languages such as Spanish (es), Catalan (ca), Portuguese (pt), etc.), one can just augment word for word translation with

- robust lexical processing (including multi-word units)
- lexical categorial disambiguation (part-of-speech tagging)
- local structural processing based on simple and well-formulated rules for frequent structural transformations (reordering, agreement)

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# Rationale /2

- It should be possible to generate the whole system from linguistic data (monolingual and bilingual dictionaries, grammar rules) specified in a declarative way.
- This information should be provided in an interoperable format ⇒ XML. There are four basic file types (DTDs):
  - (language-independent) rules to treat text formats
  - specification of the part-of-speech tagger
  - morphological and bilingual dictionaries and dictionaries of orthographical transformation rules

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structural transfer rules

Background Rationale Why open source? The Apertium architecture Modules

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- It should be possible to have a single generic (language-independent) engine reading language-pair data ("separation of algorithms and data")
- Language-pair data should be preprocessed so that the system is fast (>10,000 words per second) and compact; for example, lexical transformations are performed by minimized finite-state transducers (FSTs).

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# Why open source? /1

Reasons for the open-source development of Apertium:

- To give everyone free, unlimited access to machine-translation technologies.
- To establish a modular, documented, open platform for shallow-transfer machine translation and other human language processing tasks
- To favour the interchange and reuse of existing linguistic data.
- To make integration with other open-source technologies easier.

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# Why open source? /2

More reasons for open-source development of Apertium:

- To benefit from collaborative development
  - of the machine translation engine
  - of language-pair data for currently existing or new language pairs

from industries, and academia and minority-language support groups.

- To help shift MT business from an obsolescent licence-centered model to a service-centered model.
- To radically guarantee the reproducibility of our natural language processing research
- Because it does not make sense to use public funds to develop non-free, closed-source software.

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# The Apertium architecture/1

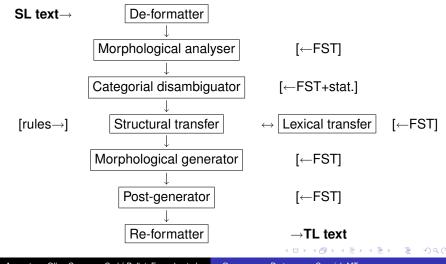
Apertium is an open-source machine translation toolbox

(http://www.apertium.org) providing:

- An open-source modular shallow-transfer machine translation engine with:
  - text format management
  - finite-state lexical processing
  - statistical lexical disambiguation
  - shallow transfer based on finite-state pattern matching
- Open-source linguistic data in well-specified XML formats for a variety of language pairs (currently including Spanish–Catalan, Spanish–Galician and Spanish–Portuguese)
- Open-source compilers to transform these linguistic data into a fast and compact form used by the engine

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### The Apertium architecture/2



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#### The Apertium architecture/3

Communication between modules: text (*pipeline*). Advantages:

- Simplifies diagnosis and debugging
- Allows the modification of data between two modules using, e.g., filters
- Makes it easy to insert alternative modules (interesting for research and development purposes)

Background Rationale Why open source? The Apertium architecture Modules

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- Separates text from format information
- Currently available for ISO-8859-1 plain text, HTML and RTF
- Based on finite-state techniques (lex)
- Generated (using a XSLT stylesheet) from an XML de-formatter specification file

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## Morphological analyser

- segments the source text in *surface forms* (SFs),
- assigns to each SF one or more *lexical forms* (LFs), each one with:
  - lemma
  - lexical category (part-of-speech)
  - morphological inflection information
- processes contractions (pt: *das*, es: *démonoslos*, etc.) and multi-word units which may be invariable (pt: *no entanto*) or variable (pt: *procurar pêlo em ovo*).
- reads finite-state transducers (letter transducers) generated from a morphological dictionary in XML (using a compiler)

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# Categorial disambiguator (part-of-speech tagger)

- picks one of the LFs corresponding to each ambiguous SF (about 30% of them) according to context
- uses hidden Markov models and hand-written constraint rules
- is trained using representative corpora for the source language (manually disambiguated or not) or, recently, using statistical models for the TL.
- its behavior is completely specified by an XML archive

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# Structural transfer /1

- It is based on finite-state techniques (finite-state recognizers)
- The XML transfer-rule file is preprocessed for faster interpreting (compiling is also possible, but generates language-pair-dependent code which has to be compiled)
- Rules have a *pattern–action* form
- It detects LF patterns to be processed using a left-to-right, longest-match strategy
- It executes the actions associated to each pattern in the rule file to generate the corresponding LF pattern for the TL (Portuguese–Spanish examples later).

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#### Lexical transfer module

- Reads each SL LF and generates the corresponding TL LF
- It reads finite-state transducers (letter transducers) generated from bilingual dictionaries in XML (using a compiler).
- It is invoked by the structural transfer module

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#### Morphological generator

- Generates from each TL LF, a TL SF, after adequately inflecting it
- It reads finite-state transducers (letter transducers) generated from a morphological dictionary in XML (using a compiler)

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#### Post-generator

- Performs some TL orthographical transformations, such as contractions (pt: de + os → dos; dizer + o → dizê-lo), inserting apostrophes (ca: de + amics → d'amics).
- It is based on finite-state transducers (letter transducers) generated from a post-generation rule dictionary (using a compiler)

Background Rationale Why open source? The Apertium architecture Modules

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- Integrates format information (plain ISO-8859-1 text, HTML and RTF) into the translated text.
- It is based on finite-state techniques (lex)
- It is generated (using a XSLT stylesheet) from an XML de-formatter specification file

Lexical data Lexical disambiguation data Structural transfer rules Post-generation data A quick evaluation

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#### Linguistic data for the Portuguese–Spanish pair

- Data open for active development through the SourceForge CVS server (developers sought: contact mlforcada@users.sourceforge.net).
- Last pt-es language-pair data package released: apertium-es-pt-0.9 [May 5, 2006]

Lexical data Lexical disambiguation data Structural transfer rules Post-generation data A quick evaluation

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#### Lexical data

- Lexical data are for *European* Portuguese, but currently recognize many Brazilian Portuguese forms in the pt→es direction
- The pt morphological dictionary contains 10,440 lemmas
- The es morphological dictionary contains 11,629 lemmas
- The es-pt bilingual dictionary contains 11,307 lemma-lemma correspondences

Lexical data Lexical disambiguation data Structural transfer rules Post-generation data A quick evaluation

### Lexical disambiguation data

- The *fine* inflection information delivered by the morphological analyser is grouped in a small set of *coarse* tags (pt: 128 tags, es: 78 tags).
- To simplify the lexical part of the HMM, words are grouped in ambiguity classes (pt: 459 classes, es: 260 classes)
- HMM trained from small hand-tagged corpora (pt: 29,214 words, es: 22,491 words) and retrained over larger untagged corpora (pt: 454,197 words, es: 520,091 words).
- Resulting HMM parameters provided in package (no need to retrain when installing)

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Lexical data Lexical disambiguation data Structural transfer rules Post-generation data A quick evaluation

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#### Structural transfer rules/1

- About 90 structural transfer rules in either direction
- About 20 "generic" rules to ensure gender and number agreement in 20 noun-phrase patterns:

um sinal vermelho (Portuguese, masc., "a red signal") → una señal roja (Spanish, fem.)

• About 70 specific rules (next 3 slides)

Lexical data Lexical disambiguation data Structural transfer rules Post-generation data A quick evaluation

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### Structural transfer rules/2

- Agreement of adjectives in sentences with the verb ser ("to be"): O sinal é vermelho (pt, masc., "The signal is red") → La señal es roja (es, fem.).
- Verb tense selection: for example, futuro do conjuntivo: quando vieres (pt) ["when you come"] → cuando vengas (es)

se vieres (pt) ["if you came"]  $\rightarrow$  si vinieras (es)

Lexical data Lexical disambiguation data Structural transfer rules Post-generation data A quick evaluation

#### Structural transfer rules/3

- Clitic pronoun rearrangements: *enviou-me* (pt) → *me envió* (es) ["he/she/it sent me"]; *para te dizer* (pt) → *para decirte* (es) ["to tell you"], etc.
- Adding the preposition a in modal constructs: (vai comprar (pt) → va a comprar (es) ["is going to buy"]).
- Comparatives:
  - reordering (mais dois carros (pt)  $\rightarrow$  dos coches más (es) ["two more cars"]) and
  - translating *do que* (pt) ["than"] as *que* (es) in *mais...do que*...constructs

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### Structural transfer rules/4

- Lexical rules: translating muito (pt) → muy/mucho (es) ["very", "much"] or primeiro (pt) → primer/primero (es) ["first"].
- Progressive constructs: (pt) estar a + infinitive → (es) estar + gerund (to be + -ing).
- Syntactic changes: (pt) "gosto de cantar" ("I like to sing")
   → (es) "me gusta cantar".

Lexical data Lexical disambiguation data Structural transfer rules Post-generation data A quick evaluation

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# Post-generation data

Rules are word-boundary string-to-string correspondences; regularities ( $de + aquele/a/es/as \rightarrow daquele/a/es/as$ ) are grouped in substring-to-substring paradigms

- pt: 54 rules, using 16 paradigms
- es: 26 rules, using 5 paradigms

Lexical data Lexical disambiguation data Structural transfer rules Post-generation data A quick evaluation

# A quick evaluation

A preliminary evaluation (5000 words) on version 0.9 (May 5, 2006).

- pt-es: 94.4 % coverage, 11,3 % error<sup>1</sup>
- es-pt: 94.5% coverage, 4,7% error
- Speed surpassing 5,000 words per second on a Pentium IV at 3 GHz.

<sup>1</sup>Number of 1-word edit operations (insertions, deletions, substitutions) per 100 words

Armentano-Oller, Carrasco, Corbí-Bellot, Forcada et al. Open-source Portuguese–Spanish MT

# Concluding remarks

- An open-source pt-es linguistic data package for the Apertium open-source shallow-transfer machine translation toolbox has been described.
- Very promising results are obtained with dictionaries containing 10,000 lemmas and with rule files containing less than 100 transfer rules.
- These results may improve dramatically when linguistic data grow (collaboration welcome!).
- Further improvements may come from enhancements to the Apertium architecture which is actively being developed.

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#### Partially funded by

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