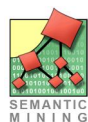


Semantic Atomicity and Multilinguality in the Medical Domain: Design Considerations for the **MorphoSaurus** Subword Lexicon



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Context: Subword indexing for multilingual semantic document indexing

Medical sublanguage: large, dynamic, multi-lingual, heterogeneous user community, rich morphology, highly derivative, single-word compounds, expert-layperson language gap

Subwords as atomic sense units

Atomic senses (in a given language and a given domain context) cannot be univocally derived from the sense(s) of its lexical constituents.

Atomic senses can inhere in word stems: (*hepat-*), affixes (*anti-*, *hyper-*, *-ectomy*, *-logy*), word fragments (*diagnost-*, *hypophys-*), straight words (*milz*, *spleen*), combinations of words (*yellow fever*, *vitamin C*).

Representation of (sub)word senses

Each sense is represented by one *MID* (MorphoSaurus ID)
 $D = (\text{lexeme}, \text{MID}, \text{domain}, \text{language})$

- Synonymy: $(\text{lex}_1; \text{MID}_1; \text{dom}_1; \text{lang}_1); (\text{lex}_2; \text{MID}_1; \text{dom}_1; \text{lang}_1); (\text{lex}_3; \text{MID}_1; \text{dom}_1; \text{lang}_1)$
Example: *neph-*, *ren-*, *kidney*
- Translation: $(\text{lex}_1; \text{MID}_1; \text{dom}_1; \text{lang}_1); (\text{lex}_2; \text{MID}_1; \text{dom}_1; \text{lang}_2)$
Example: *neph-*, *riñon*
- Ambiguity: $(\text{lex}_1; \text{MID}_1; \text{dom}_1; \text{lang}_1); (\text{lex}_1; \text{MID}_2; \text{dom}_1; \text{lang}_1)$
Example: *head* (body part vs. chief)
- Coincidence: $(\text{lex}_1; \text{MID}_1; \text{dom}_1; \text{lang}_1); (\text{lex}_1; \text{MID}_2; \text{dom}_1; \text{lang}_2)$
Example: *era* (epoch vs. Spanish past of "to be")
- Domain specificity: $(\text{lex}_1; \text{MID}_1; \text{dom}_1; \text{lang}_1); (\text{lex}_1; \text{MID}_2; \text{dom}_2; \text{lang}_1)$
Example: *aspirin* (in *dom*₂ brand name $\neq$ substance)

MIDs can be interrelated by two relations:

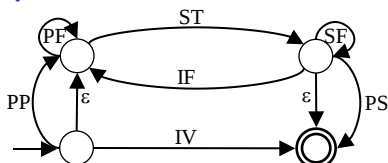
- Expands* ($\text{MID}_0; \{\text{MID}_1; \text{MID}_2; \dots; \text{MID}_3\}$)
Use: express composed meaning which cannot be suitably expressed by the word composition.
Example: *Expands*($\text{MID}_{\text{urinalysis}}$; $\{\text{MID}_{\text{urine}}; \text{MID}_{\text{analysis}}\}$)
- Has-Sense* ($\text{MID}_0; \{\text{MID}_1; \text{MID}_2; \dots; \text{MID}_3\}$)
Use: treatment of lexical ambiguities.
Example: *Has-Sense* (MID_{head} ; $\{\text{MID}_{\text{caput}}; \text{MID}_{\text{chief}}\}$)

Implementation in MorphoSaurus

Classification and description of lexicon entries in terms of:

- Lexeme classes:
 - Stems (ST), e.g. *hepat*, *enferm*, *diaphys*, *head*
 - Prefixes (PF), *de-*, *re-*, *in-*,
 - Proper Prefixes (PP) cannot be prefixed, e.g. *peri-*, *hemi-*, *down*
 - Infixes (IF), like *-o-*, e.g., in *gastr-o-intestinal*,
 - Suffixes (SF) e.g. *-a*, *-io*, *-ion*, *-tomy*, *-itis* follow a
 - Proper Suffixes (PS) cannot be suffixed, *-ing*, *-ieron*, *-ção*,
 - Invariants (IV), occur isolated e.g. *ion* or *gene*
- Language (English, French, German, Swedish, Spanish, Portuguese)
- MID (equivalence class identifier), only assigned to semantically relevant lexemes
- Inter-MID relations *Expands* and *Has-Sense* (see above)

Word parser



Morphosemantic indexing example

Original Document	Orthographic Normalization	Morphological Segmentation	Semantic Normalization
High TSH values suggest the diagnosis of primary hypothyroidism while a suppressed TSH level suggests hyperthyroidism.	high tsh values suggest the diagnosis of primary hypothyroidism while a suppressed tsh level suggests hyperthyroidism.	high tsh value s suggest the diagnosis of primary hypo thyroidism while a suppress ed tsh level suggest s hyper thyroidism.	<i>#up# tsh #value# #suggest# #diagnost# #primar# #small# #thyre# #suppress# tsh #nivell# #suggest# #up# #thyre#</i>
Erhöhte TSH-Werte erlauben die Diagnose einer primären Hypothyreose, ein supprimierter TSH-Spiegel spricht dagegen für eine Schilddrüsenüberfunktion.	erhoehte tsh-werte erlauben die diagnose einer primaeren hypothyreose, ein supprimierter tsh-spiegel spricht dagegen fuer eine schilddruesenueberfunktion.	er hoeh te tsh - wert e erlaub en die diagnos e einer primaer en hypo thyre ose, ein supprim iert er tsh - spiegel spricht dagegen fuer eine schilddrues en ueber funktion.	<i>#up# tsh - #value# #permit# #diagnost# #primar# #small# #thyre# #suppress# tsh - {#mirron# #nivell#} #speak# #thyre# #up# #function#</i>
A presença de valores elevados de TSH sugere o diagnóstico de hipotireoidismo primário, enquanto níveis suprimidos de TSH sugerem hipertireoidismo.	a presença de valores elevados de tsh sugere o diagnostico de hipotireoidismo primario, enquanto niveis suprimidos de tsh sugerem hipertireoidismo.	a presenc a de valor es elevad os de tsh suger e o diagnost ico de hipo tireoid ismo primari o, enquanto niveis suprimid os de tsh suger em hiper tireoid ismo.	<i>#actual# #value# #up# tsh #suggest# #diagnost# #small# #thyre# #primar# #nivell# #suppress# tsh #suggest# #up# #thyre#</i>

Pragmatics of lexicon building and maintenance

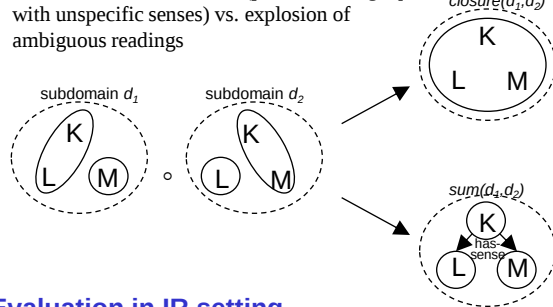
- Delimitation of subwords

Generation of raw list of morphemes by automated affix stripping.

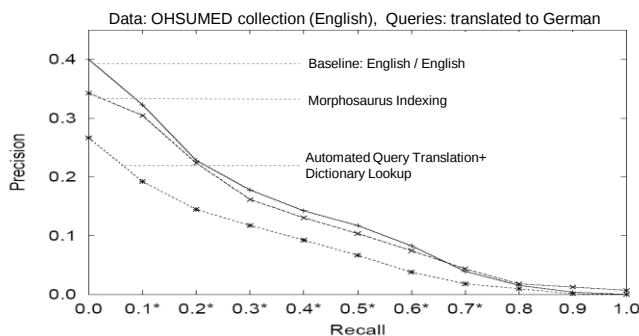
- Morpheme candidates are eliminated when utterly short and ccurring as accidental substrings (causing parsing errors), e.g. *ov-*, *gen-*
- Morpheme combinations are added when composed form has a non-compositional sense, e.g. *bauch|speichel|drüs-de|cubit-, neur|os-*
- Delimitation decisions driven by performance function:
Precoding of suffix combinations, e.g. *-ibilities*, *-alitäten*
Prevention of known segmentation errors:
nephrotomy -> *neph-oto-my* (correct: *neph-r-o-tomy*)
addition of *-otomy* solves the problem.

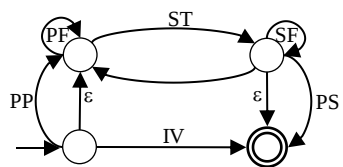
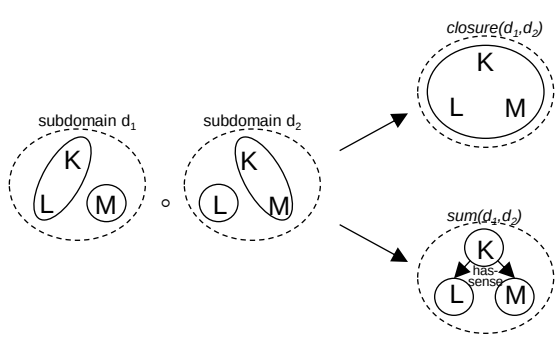
- Grouping of lexemes

- Creation of equivalence (synonym, translation) classes by incremental fusion of MIDs.
- Tradeoff : fusion of senses (problem of big equivalence classes with unspecific senses) vs. explosion of ambiguous readings

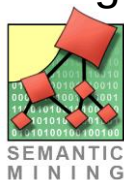


Evaluation in IR setting





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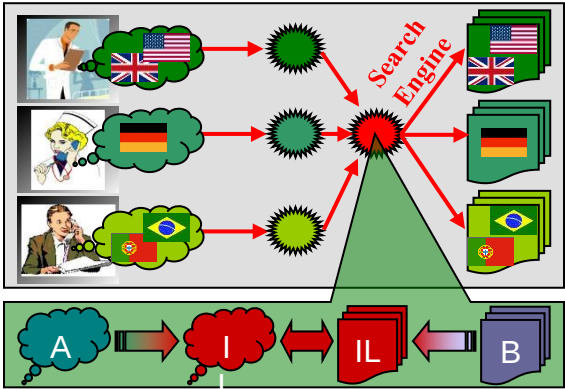


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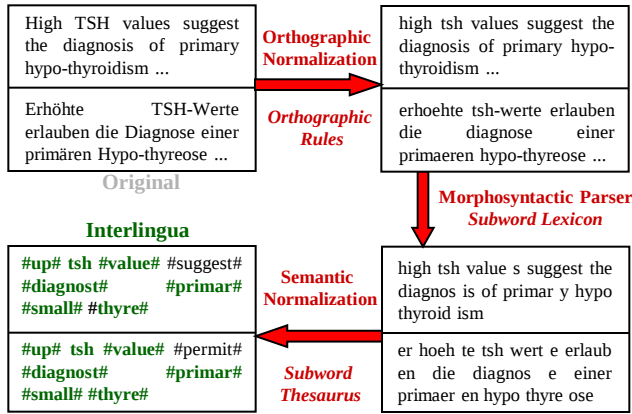


Medical document collections are very large, dynamic, multi-lingual, multi-genre and used by a heterogeneous user community.
We respond to these challenges for **medical information retrieval** in terms of the **MorphoSaurus** system which is based upon using an **interlingua** representation of both queries and documents.



Interlingual representation: Queries from language A as well as documents from language B are both translated into a language-independent interlingua (IL) on which matching procedures apply.

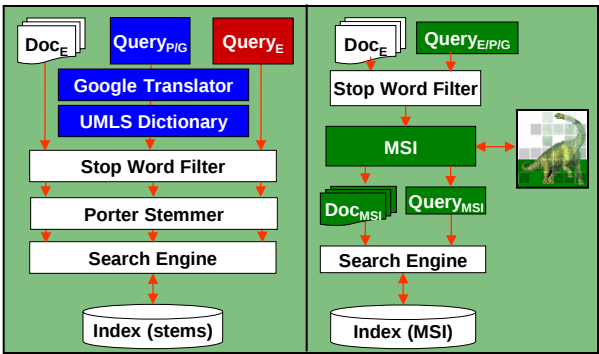
The Morphosaurus system uses a special type of **dictionary**, with entries consisting of **subwords**, i.e., semantically minimal units. Subwords are grouped into **equivalence classes** which capture **intra-lingual** as well as **inter-lingual** synonymy.
A **morphosyntactic parser** extracts subwords and assigns equivalence class identifiers.



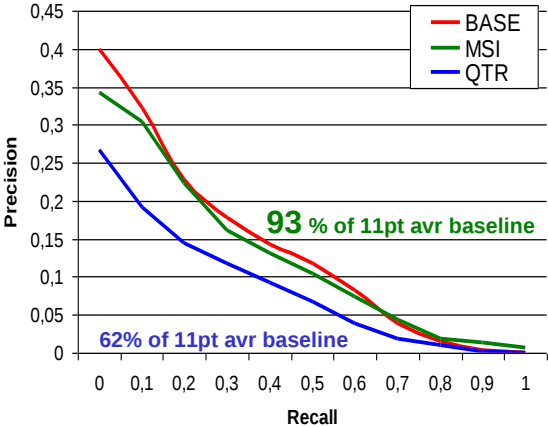
Interlingual **Morpho-semantic Normalization** is achieved by a three-step procedure: orthographic normalization, morphological segmentation and semantic normalization.

Evaluation with the **OHSUMED Corpus** (~233,000 English documents, 106 English queries – translated to German and Portuguese by medical experts)

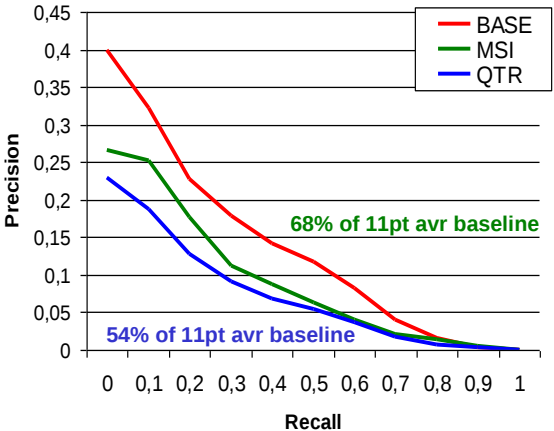
Baseline: monolingual retrieval, $Query_E \leftrightarrow Doc_E$
QTR: Query translation - GOOGLE translator & bilingual UMLS dictionary
MSI: Morphosaurus - morpho-semantically indexed queries and documents



Evaluation scenarios: **Baseline** (left), **query translation** (left), **morpho-semantic indexing (MSI)** (right)



German



Portuguese