

Goal: build a Verbnet like classification for French

associating groups of verbs with

- subcategorisation frames
- thematic role sets.

based on French and English lexical resources

- Manually built
- French: subcategorisation lexicons
- English: Verbnet

using IGNGF (Incremental Growing Neural Gas with Feature maximisation) Lamirel et al. (2011)

- Growing neural gas clustering method
 - based on Hebbian learning
 - incremental
 - *winning* clusters determined through distance function

IGNGF

- uses feature maximisation to determine *winning* cluster
- supports cluster labeling with distinguishing features

IGNGF: feature maximisation

- Cluster relevant features: cluster maximising features

Feature f maximising cluster c

Feature F-measure $FF_c(f)$ higher for c than other cluster

$$\text{Feature recall } FR_c(f) = \frac{\text{verbs in } c \text{ having } f}{\text{all verbs having } f}$$

$$FR_c(f) = \frac{\sum_{v \in c} W_v^f}{\sum_{c' \in C} \sum_{v \in c'} W_v^f}$$

$$\text{Feature precision } FP_c(f) = \frac{(f, \text{verb}) \text{ combinations in } c}{\text{all (feature, verb) combinations in } c}$$

$$FP_c(f) = \frac{\sum_{v \in c} W_v^f}{\sum_{f' \in F_c, v \in c} W_v^{f'}}$$

Lexical Resources: French and English, manually developed → extract features for IGNGF clustering

French: Dicovalence, Ladl tables and TreeLex → features:

- 1 subcategorisation frames (**scf**)
- 2 additional syntactic (**synt**) and semantic (**sem**) features

	Feature	Description	VN class	Feature	Description	VN class
Mostly syntactic (synt):	ArgNbr	4 or more arguments	<i>get, send, ...</i>	Event	clausal argument	<i>correspond, characterize, say, ...</i>
Mostly semantic (sem):	Loc	location role	<i>put, remove, ...</i>	Nhum	concrete object, non human role	<i>hit, other_cos, ...</i>

English: Verbnet Kipper Schuler (2006) → features:

- translate English Verbnet classes to French using dictionaries
- use SVM to decide: does verb in ⟨verb, VN class⟩ pair have roles of VN class?
- 3 verb has **grid** feature: verb ∈ translated VN class with thematic role set given by grid.

Evaluation: Reference and Metrics

Reference Sun et al. (2010)

- 116 verbs in 16 Levin classes
 - Levin classes identified with Verbnet thematic role sets
 - Thematic role sets are grouped
- 116 verbs in 11 classes

Example:

Thematic roles: AgExp, Instrument, Patient

hit-18.1: cogner, heurter, battre, frapper, fouetter, taper, rosser, brutaliser, éreinter, maltraiter, corriger
other_cos-45.4: mélanger, fusionner, consolider, renforcer, fortifier, adoucir, polir, atténuer, tempérer, pétrir, façonner, former

Metrics

Supervised: mPUR & ACC

- How well can the clustering be embedded into gold?
Cluster $C \rightarrow \text{prev}(C) \in \text{gold classification with maximal } |\text{prev}(C) \cap C|$

$$\text{mPUR} = \frac{\sum_{C \in \text{Clustering}, |\text{prev}(C)| > 1} |\text{prev}(C) \cap C|}{\sum_{C \in \text{Gold}} \text{Verbs}_{\text{Clustering} \cap C}}$$

- How well can the gold be embedded into the clustering?
gold class $C \rightarrow \text{dom}(C) \in \text{clustering with maximal } |\text{dom}(C) \cap C|$

$$\text{ACC} = \frac{\sum_{C \in \text{Gold}} |\text{dom}(C) \cap C|}{\sum_{C \in \text{Gold}} \text{Verbs}_C}$$

Unsupervised: CMP

- Cumulative Micro Precision, Lamirel et al. (2011), *unsupervised clustering metric*
- Evaluates cluster quality wrt. cluster features

$$\text{CMP} = \frac{\sum_{i=|C_{\text{inf}}| \dots |C_{\text{sup}}|} \frac{1}{|C_{i+}|^2} \sum_{c \in C_{i+}, f \in F_c} P_c^f}{\sum_{i=|C_{\text{inf}}| \dots |C_{\text{sup}}|} \frac{1}{|C_{i+}|}}$$

C_{inf} = smallest cluster size
 C_{sup} = largest cluster size

C_{i+} = clusters with more verbs than i
 $P_c^f = \frac{|\text{verbs } \in c \text{ having } f|}{|\text{verbs } \in c|}$

Results

Sample cluster:

C6- 14(14) [197(197)]
Prevalent Label — = AgExp-Cause

0.341100 G-AgExp-Cause
0.274864 C-SUJ:Ssub,OBJ:NP
0.061313 C-SUJ:Ssub
0.042544 C-SUJ:NP,DEOBJ:Ssub

0.017787 C-SUJ:NP,DEOBJ:VPinf
0.008108 C-SUJ:VPinf,AOBJ:PP
...

[**déprimer 0.934345 4(0)] [affliger 0.879122 3(0)] [éblouir 0.879122 3(0)]
[choquer 0.879122 3(0)] [décevoir 0.879122 3(0)] ...

Impact of feature set

Feat. set	mPUR	ACC	F (Gold)	#class	CMP at opt (13cl.)
scf	0.93	0.48	0.64	17	0.28 (0.27)
grid, scf	0.94	0.54	0.68	14	0.12 (0.12)
grid, scf, sem	0.86	0.59	0.70	13	0.30 (0.30)
grid, scf, synt	0.87	0.50	0.63	14	0.13 (0.14)
grid, scf, synt, sem	0.99	0.52	0.69	16	0.50 (0.22)
scf, sem	0.83	0.55	0.66	23	0.40 (0.26)
scf, synt	0.91	0.45	0.61	15	0.17 (0.22)
scf, synt, sem	0.89	0.47	0.61	16	0.57 (0.11)
Sun et al. (2010)	0.55-0.65, depending on verb frequency				

- semantic features – **grid**, **sem** – help clustering
- IGNGF clustering outperforms results in Sun et al. (2010) but not entirely comparable

Comparison with K-means – **grid**, **scf**, **sem** feature set

Method	mPUR	ACC	F (Gold)	#classes	CMP(13cl.)
IGNGF with IDF and norm.	0.86	0.59	0.70	13	0.30 (0.30)
K-means with IDF and norm.	0.88	0.57	0.70	13	0.10 (0.10)
IGNGF, no IDF	0.86	0.59	0.70	17	0.18 (0.14)
IGNGF, no norm.	0.78	0.62	0.70	18	0.15 (0.11)
IGNGF, no IDF, no norm.	0.87	0.55	0.68	14	0.21 (0.21)

- K-means & IGNGF have similar F-measure
- CMP: IGNGF clusters more coherent in terms of features.

Conclusion

- Approach to large scale verb classification for French
- Showed good results on established test set
- Cluster labeling allows association of verb classes with
 - subcategorisation frames
 - thematic role sets

Future Work

- What is quality of associations of verbs with
 - subcategorisation frames
 - thematic role sets
- Is evaluation on very small test set conclusive?
- Produce overlapping clustering to represent polysemy
- Produce hierarchical clustering – more similar to Verbnet

References

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