# **Combining Abstractness and Language-specific Theoretical Indicators for Detecting Non-Literal Usage of Estonian Particle Verbs**



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### GOALS

- Create two **datasets** for a low-resource Estonian.
- Build a random-forest **classifier** to automatically predict literal vs. non-literal language usage of particle verbs.
- Ascertain the importance of language-specific features when combined with language-independent features of abstractness.

#### **ESTONIAN PARTICLE VERB**

Estonian particle verb = an adverbial particle + base verb (e.g., *alla andma* 'to give up')

#### Challenging because:

- their components do not always appear adjacent to each other
- the particles are homonymous with adpositions
- the same PV can be used in literal (1) vs. non-literal (2) language



#### DATASETS

- Dataset of literal and non-literal language usage for Estonian PVs: 210 PVs across 34 particles, 1490 sentences.
- Automatically created abstractness ratings for 243,675 Estonian lemmas.
- Available at http://github.com/eleriaedmaa/

## **CLASSIFICATION RESULTS**

feature type		acc	$F_1$	
			n-lit	lit
majority baseline		74.0%	85.0	0.00
1	particle (p)	73.6%	84.4	13.6
2	base verb (v)	81.2%	87.9	58.0
3	unigrams, f>5 (uni)	82.3%	89.0	54.6
4	average rating of words (abs)	68.1%	79.8	24.5
5	average rating of nouns (abs)	68.5%	79.7	30.1
6	rating of the PV subject (abs)	72.3%	83.1	23.7
7	rating of the PV object (abs)	73.0%	83.5	25.2
8	subject case (case)	74.0%	85.0	0.00
9	object case (case)	74.0%	85.0	0.00
10	subject animacy (animacy)	74.0%	85.0	0.00
11	object animacy (animacy)	74.0%	85.0	0.00
12	case government (govern)	73.8%	84.6	10.1
p+v, 1–2		85.2%	90.3	68.7
v+uni, 2–3		84.2%	89.6	66.4
p+v+uni, 1–3		85.0%	90.1	68.5
p+v+abs, 1–2, 4–6		86.3%	90.9	72.3
p+v+abs, 1–2, 4–7		86.0%	90.7	71.3
p+v+abs, 1–2, 5–6		86.0%	90.7	71.9
p+v+case, 1–2, 8		85.3%	90.4	68.9
p+v+case, 1–2, 8–9		84.6%	89.7	69.3
p+v+animacy, 1–2, 10–11		86.2%	90.8	72.3
p+v+govern, 1–2, 12		86.2%	90.9	71.6
p+v+abs+lang, 1–2, 4–6, 10–12		87.3%	91.6	73.8
p+v+abs+lang, 1–2, 4–12		87.5%	91.8	73.8
numberlang 1 7 5 6 8 10 17		<b>97</b> 0 <i>0</i> /.	02 0	75 0

- (1)Ta **astu-s** kaks sammu **tagasi**. he step-pst.3sG two step.prt back 'He took two steps back.'
- ameti-st **tagasi**. Ta **astu-s** (2)he step-pst.3sg job-ELA back 'He resigned from his job.'

#### FEATURES

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- **particle** particle of the particle verb
- **verb** verb of the particle verb
- **unigrams** lemmas of content words that occur in the same sentences with target PVs
- **abstractness features** average rating of 12 **case government** case of the argument of 4–7 all words in a sentence, average rating of all nouns in a sentence, rating of the PV subject, value = one of the 14 cases rating of the PV object

the particle verb (excluding subject and object);







**case features** – case of the PV subject 10–11 **animacy features** – whether the subject 8-9 (nominative or partitive) and PV object (nom- and object are alive or not inative, genitive or partitive)



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#### CONCLUSION

Language-specific features **subject case**, **subject animacy** and case government combined with abstractness ratings as well as **verb** and **particle** information classify literal vs. non-literal usage of PVs with accuracy 87.9%.

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