# Challenging Learners in Their Individual Zone of Proximal Development Using Pedagogic Developmental Benchmarks of Syntactic Complexity

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# Complexity

A polysemous and multidimensional construct.

- Task, cognitive, or linguistic complexity (Bulté and Housen, 2012; Vyatkina et al., 2015)
- Linguistic perspective: "the extent to which language produced in performing a task is **elaborate** and **varied**" (Ellis, 2003)
- Sub-constructs: lexical, morphological, syntactic, semantic, pragmatic and discoursal (Lu, 2010, 2011; Lu and Ai, 2015; Ortega, 2015; Mazgutova and Kormos, 2015; Jarvis, 2013; Kyle and Crossley, 2015)

# Complexity and SLA

#### Applications:

- interlanguage development analysis (Lu, 2011; Lu and Ai, 2015; Mazgutova and Kormos, 2015)
- performance evaluation (Yang et al., 2015; Taguchi et al., 2013)
- readability assessment (Vajjala and Meurers, 2012; Nelson et al., 2012)

#### Tools:

- CohMetrix (McNamara et al., 2014)
- L2 Syntactic Complexity Analyzer (Lu, 2010)
- Common Text Analysis Platform (Chen and Meurers, 2016)
- Kristopher Kyle's automatic text analysis tools
  http://www.kristopherkyle.com/tools.html

# Syntactic Complexity and Proficiency Development

Advanced learners usually demonstrate the ability to understand and produce more complex language because of

- the expansion of their syntactic repertoire, and
- the increase of their capacity to use a wider range of linguistic resources (Ortega, 2015)

Proficiency development means

- progressively more elaborate language, and
- greater variety of syntactic patterning (Foster and Skehan, 1996)

As a result, syntactic complexity is often used to **determine proficiency** or **assess performance** in the target language (Larsen-Freeman, 1978; Ortega, 2003, 2012; Vyatkina et al., 2015; Wolfe-Quintero et al., 1998; Lu, 2011; Taguchi et al., 2013; Yang et al., 2015; Sotillo, 2000).

# Researching Developmental Syntactic Complexity

- Developmental perspective is "...the core of the phenomenon of L2 syntactic complexity" (Ortega, 2015)
- To SLA theory: understanding the developmental trajectories
- To LT practice:
  - Selecting appropriate learning materials
  - Providing reference frame for testing the effectiveness of instructional interventions

# Development of Syntactic Complexity in Learner Corpora

Learner corpora have been used to investigate:

- the most informative complexity measures across proficiency levels (Lu, 2011; Ferris, 1994; Ishikawa, 1995)
- the patterns of development for different syntactic measures (Bardovi-Harlig and Bofman, 1989; Henry, 1996; Larsen-Freeman, 1978; Lu, 2011)
- the developmental trajectory of syntactic complexity from the learner production (Ortega, 2000, 2003; Vyatkina, 2013b; Vyatkina et al., 2015).

**One thing in common**: analyzing syntactic complexity development based on learners' production.

# Challenges with Learner Corpora (1)

- Learner corpora vary with
  - learner background
  - production tasks
  - instructional settings
- Inconsistent, contradicting findings, e.g., the correlation between subordination frequency and proficiency level have been found to be
  - positive (Aarts and Granger, 1998; Granger and Rayson, 1998; Grant and Ginther, 2000),
  - negative (Lu, 2011; Reid, 1992), and
  - uncorrelated (Ferris, 1994; Kormos, 2011)

# Challenges with Learner Corpora (2)

Limited robustness of NLP tools for analyzing language produced by learners at varied proficiency levels.

- Current NLP tools are reliable for analyzing the writing of learners at upper intermediate proficiency or higher (Lu, 2010, 2011).
- Developmental profiling has rarely been done for learner language below upper-intermediate proficiency levels (Ortega and Sinicrope, 2008).

# Challenges with Learner Corpora (3)

Second language proficiency development is systematically affected by individual differences, making complexity research findings from learner data chaotic and hard to generalize.

- "Non-linear waxing and waning" (Vyatkina, 2015)
- Multiple types of morphosyntactic complexity development (Norrby and Håkansson, 2007).
- Important to account for individual variation in modeling L2 development (Murakami, 2013, 2016).

# Limited Usability

Developmental benchmarks based on learner corpora are of limited practical use for **proficiency placement** or **performance assessment**.

# Pedagogic Corpus

"A large enough and representative sample of the language, spoken and written, a learner has been or is likely to be exposed to via teaching material, either in the classroom or during self study activities" (Meunier and Gouverneur, 2009).

## Advantages of TL Corpora

- Linear development of complexity measures (Vyatkina, 2013a), which is desirable for pedagogic purposes.
- Robustness of NLP processing with well-formed language, resulting in a more reliable benchmark.

## The Syntactic Benchmark System

- Analyzes the syntactic complexity of a text produced by a learner.
- Places and visualizes the text onto a developmental scale constructed from a comprehensive TL corpus.
- Proposes appropriately challenging texts from the TL corpus.

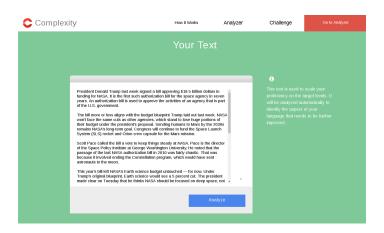
# System Details

The TL corpus: Newsela

- 14,581 news articles from Newsela
- five reading levels (human-edited) for each news story

Syntactic complexity measures: exact replicate of the L2 Syntactic Complexity Analyzer (Lu, 2010).

### System Demo



#### Outlook

- Empirically evaluate the system's effectiveness in providing input individually tailored to the i+1 in terms of linguistic complexity as a means to foster learning.
- Which level of challenge for which of the complexity measures at which domain of linguistic modeling is most effective at fostering learning?
- Consider the gap between receptive and productive knowledge, which were found to differ within learners (Zhong, 2016; Schmitt and Redwood, 2011).

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