

How Grammarly Teaches Machines

by Oleksii Sliusarenko



Problem statement

|It is og course a good idea to og for a walk.

og → of

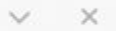


og → go



If it will rain tomorrow, I won't go for a run.

willrain → rains



Problem statement

Tom is resembled by Andy.

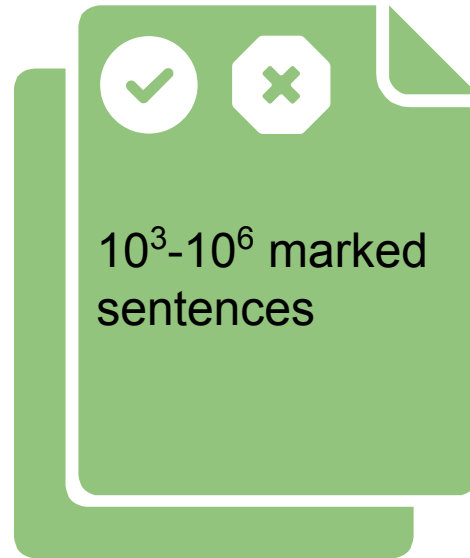
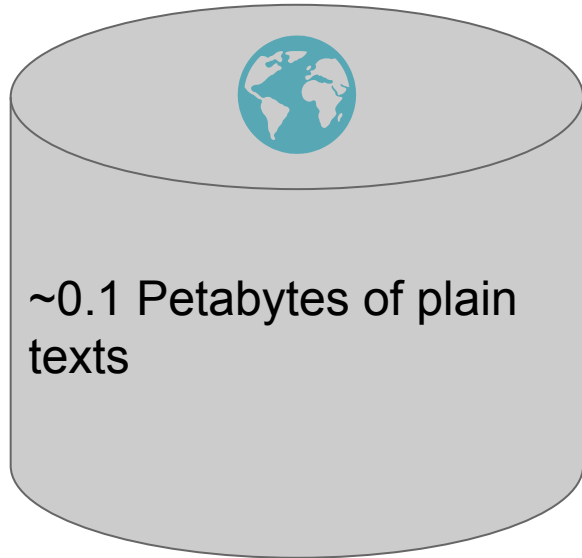
Intransitive verb in passive voice
Andy resembles Tom

If I cannot understand the material, the teacher will me.

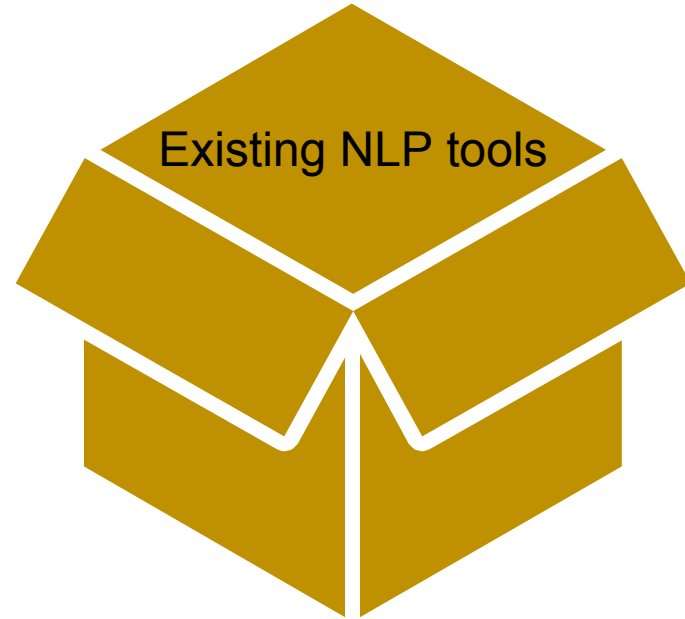
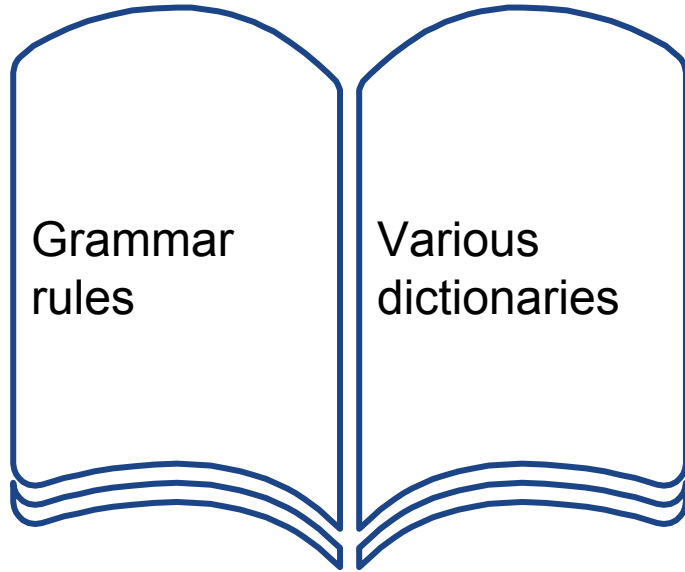
will help



Available data



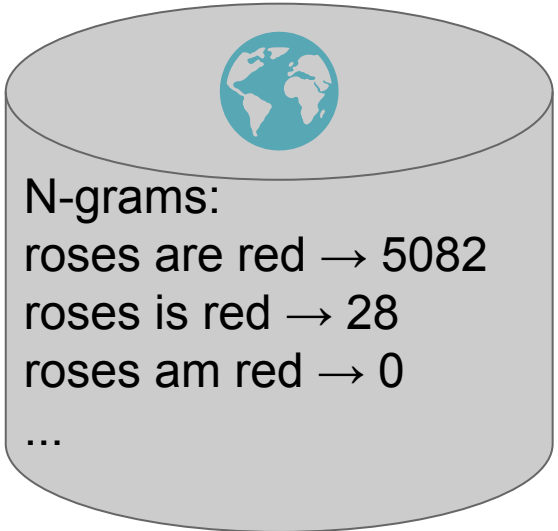
Available data



Grammarly uses all possible approaches



Rules



N-grams:

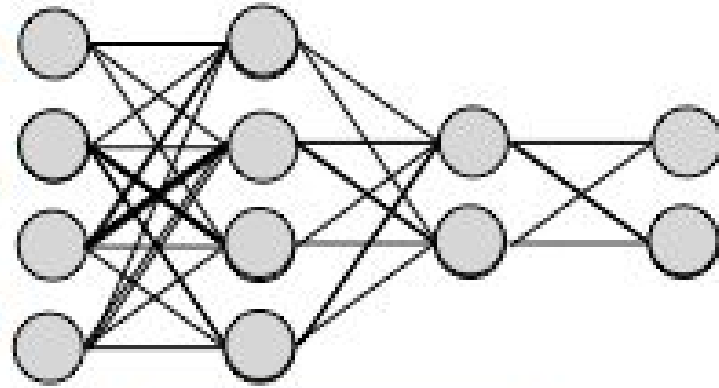
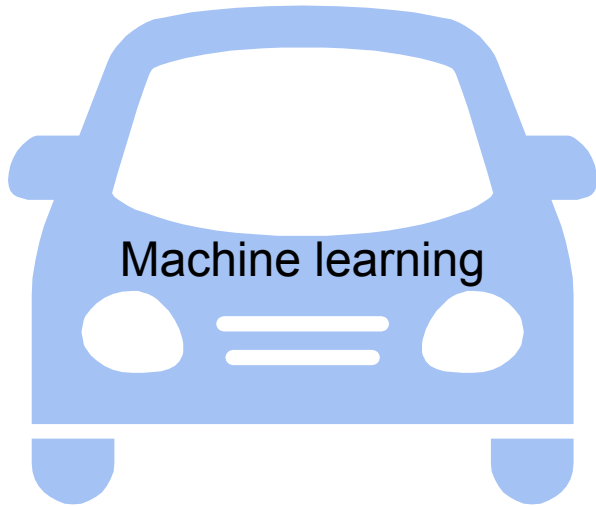
roses are red → 5082

roses is red → 28

roses am red → 0

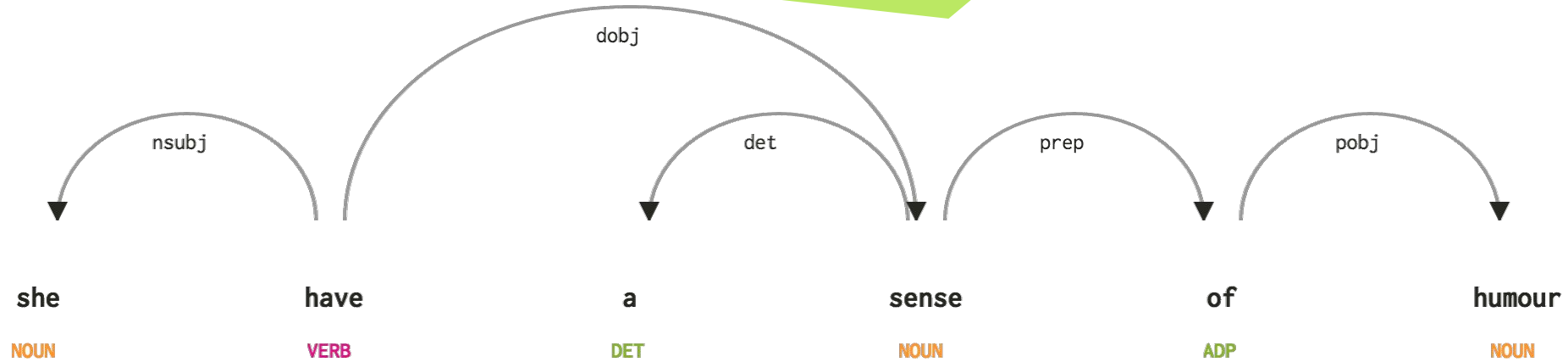
...

Grammarly uses all possible approaches



Deep learning

Rule based approach



Rules

she → third-person pronoun

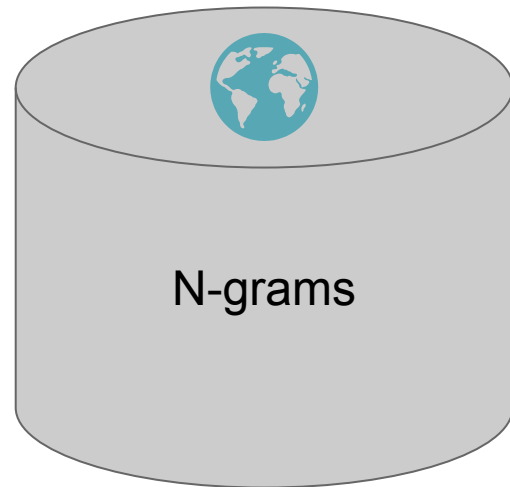
have → first-person verb

N-gram approach

Shane Bergsma, Dekang Lin, and Randy Goebel. 2009.
Web-scale N-gram models for lexical disambiguation.

Of course it helps that the **whether** is almost
always sunny and dry.

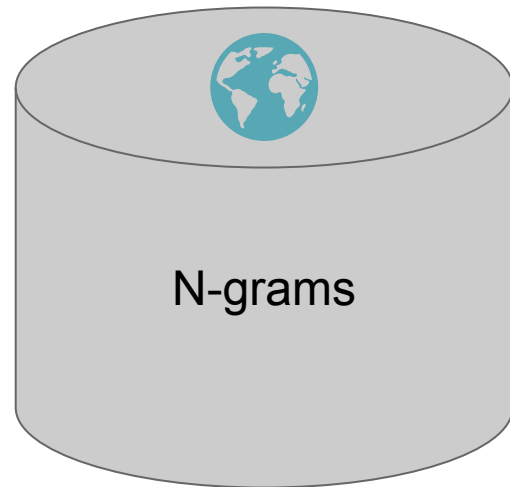
Of course it helps that the **weather** is almost
always sunny and dry.



N-gram approach

$a(5,0) = \text{freq}(\text{it helps that the } \textbf{whether})$
 $a(5,1) = \text{freq}(\text{helps that the } \textbf{whether} \text{ is})$
 $a(5,2) = \text{freq}(\text{that the } \textbf{whether} \text{ is almost})$
 $a(5,3) = \text{freq}(\text{the } \textbf{whether} \text{ is almost always})$
 $a(5,4) = \text{freq}(\textbf{whether} \text{ is almost always sunny})$

$\text{score} = \sum \log(a(i, j))$



ML approach

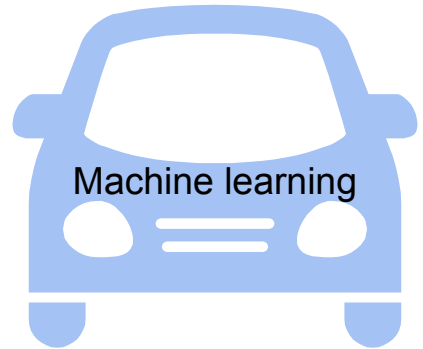
Matthew Shardlow. 2013. A Comparison of Techniques to Automatically Identify Complex Words

Complex:

Mike got spam today that contained **gibberish**.

Non-complex:

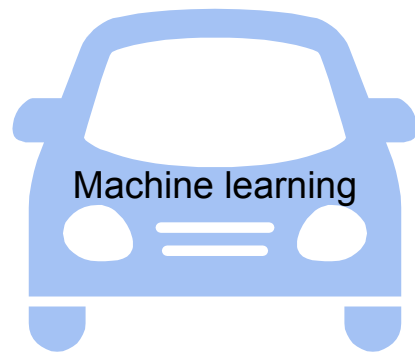
The book tells about people's **irrationality**.



ML approach

Features:

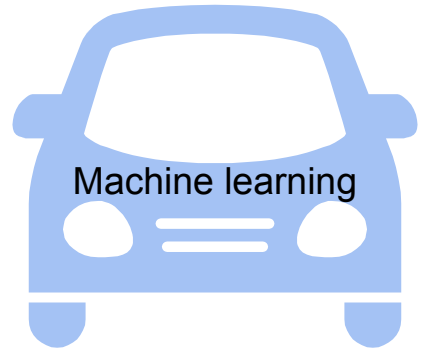
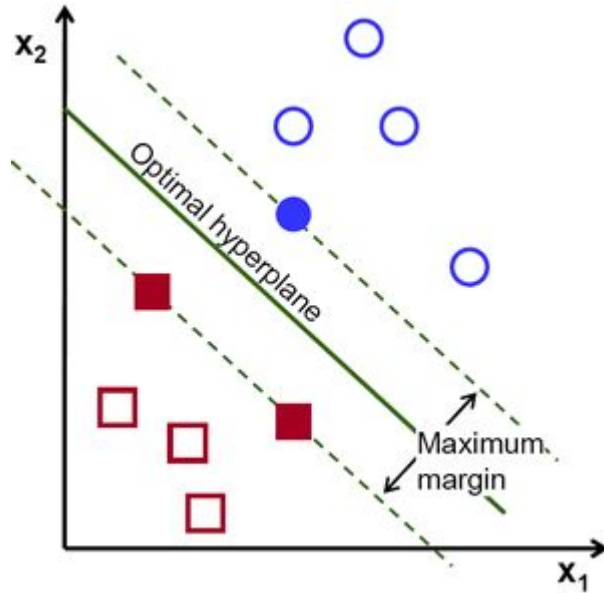
- ◆ x_1 = word frequency
- ◆ x_2 = word length
- ◆ x_3 = syllable count
- ◆ x_4 = sense count
- ◆ x_5 = synonym count



ML approach

Support vector machine:

$$w_1 * x_1 + w_2 * x_2 + \dots + w_5 * x_5 > 0$$



Deep learning approach

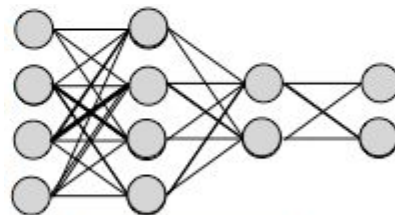
Chengjie Sun, Xiaoqiang Jin, Lei Lin, Yuming Zhao, and Xiaolong Wang. 2015. Convolutional Neural Networks for Correcting English Article Errors

wrong:

I watched **a** film you were talking about yesterday.

correct:

I watched **the** film you were talking about yesterday.



Deep learning

Deep learning approach

- ◆ No features! One-hot encoding:

rose = (0,0,0,0,1,0,0,0)

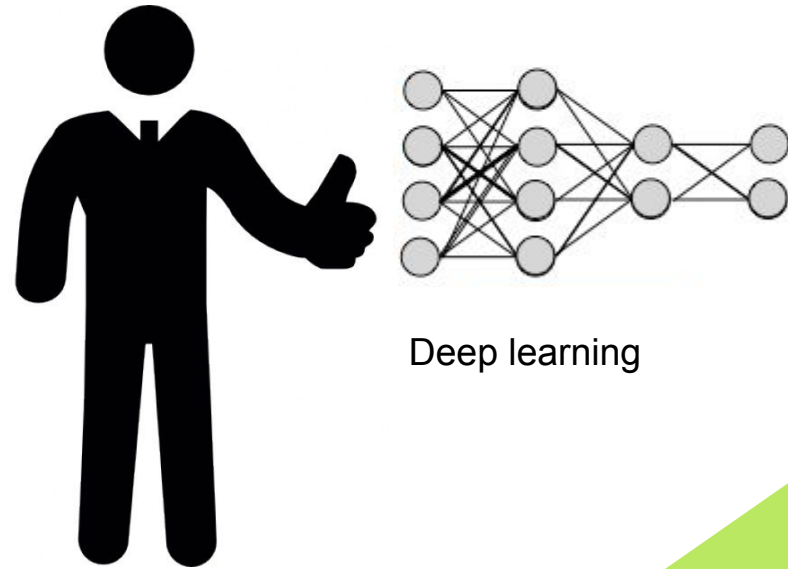
red = (0,1,0,0,0,0,0,0)

violet = (0,0,0,0,0,0,0,1)

...

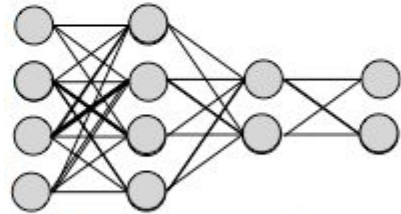
(in fact, word embeddings are used)

- ◆ Better quality
- ◆ Works for all: NLP, computer vision...



Deep learning approach

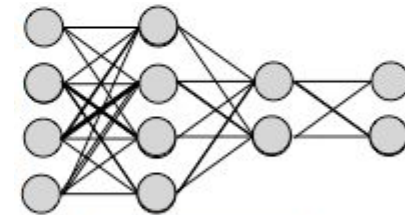
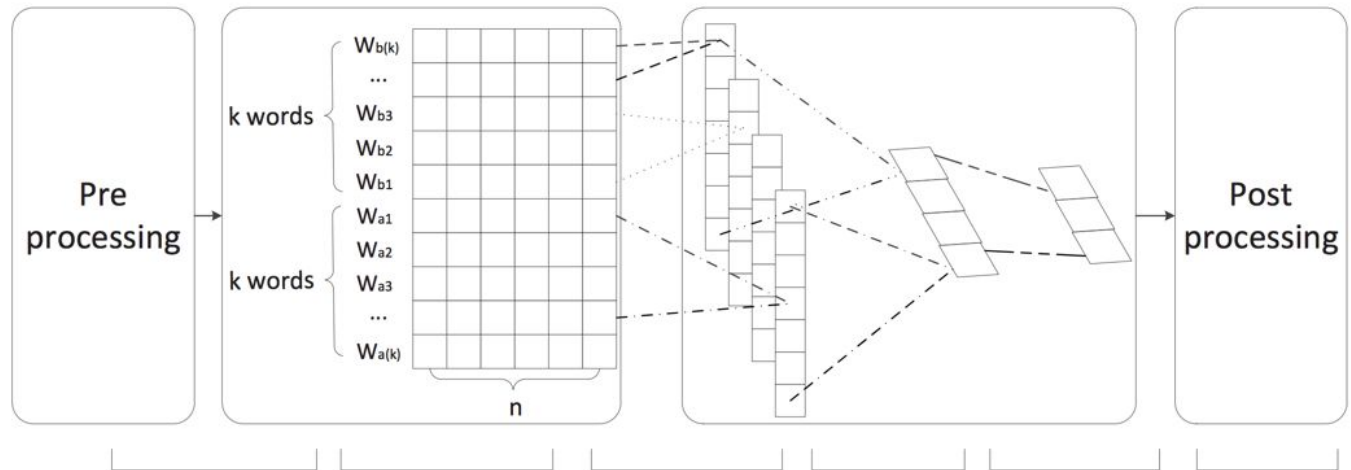
What's the catch?



Deep learning

Deep learning approach

Much harder algorithm:



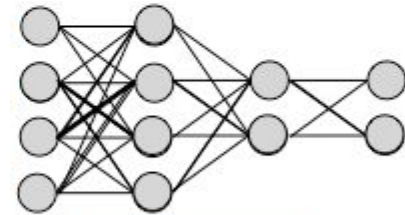
Deep learning

Pre-processing $(2*k)*n$ representation of article context with non-static channel Convolution layer with multiple filter widths and feature maps Max-over time Pooling Fully connected layer with dropout and softmax output Post-processing

Deep learning approach

- ◆ Much harder algorithm
- ◆ Needs much more data
- ◆ Needs more computation

Okay



Deep learning

Difference from academia



Big data



High precision requirement



High speed requirement



Thanks!

Any questions?



Credits

Special thanks to all the people who made and released these **awesome resources** for free:

- ◆ Presentation template by [SlidesCarnival](#)
- ◆ Photographs by [Unsplash](#)