

Introduction to Word2Vec

t.me/cvision



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Outline

- *Word Vectors*
- *Word2Vec*

Word2Vec

<http://rohanvarma.me/Word2Vec/>

<http://mccormickml.com/2016/04/19/word2vec-tutorial-the-skip-gram-model/>

<http://mccormickml.com/2017/01/11/word2vec-tutorial-part-2-negative-sampling/>

<http://runder.io/word-embeddings-1/>

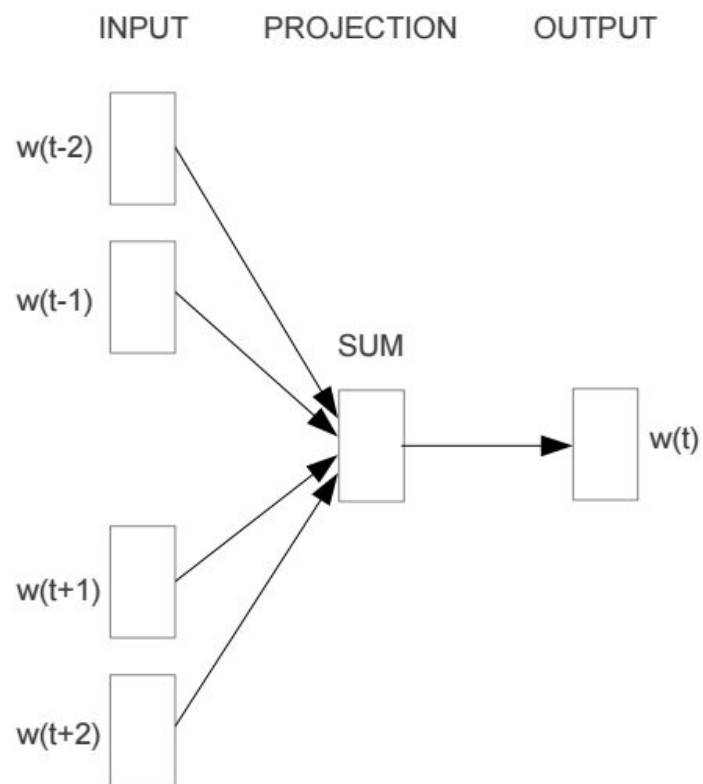
Word Vectors

- *Word Vectors, Word Embeddings or Distributed Representation of Words*, generally refer to a **Dense Vector** representation of a word, as compared to a sparse (ie **one-hot**) traditional representation
- *Word2Vec* is one of Distributed Representation of Words methods

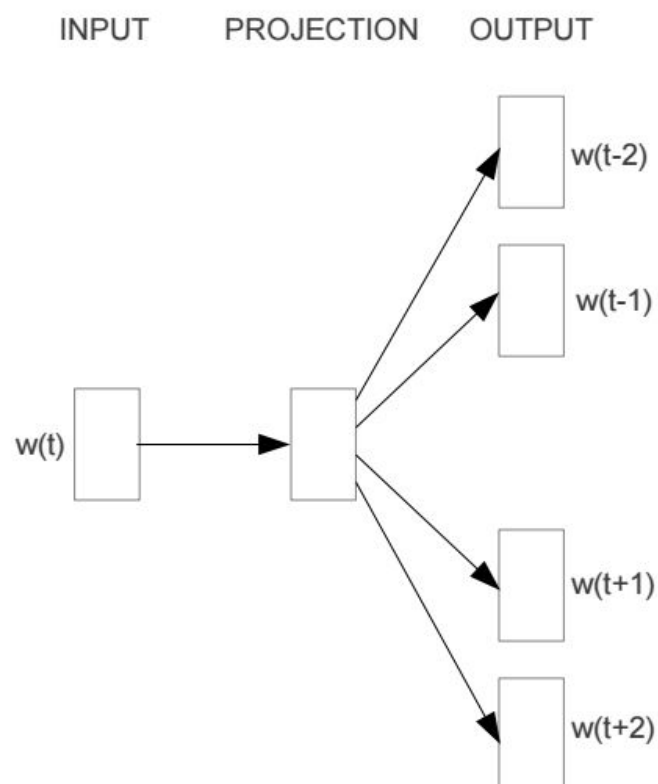
Word2Vec

- *Represent words as dense vectors*
- *Vectors feed into a discriminative model (typically an RNN)*
- *There are two different implementations of Word2Vec*
 - *Skip-Gram (SG)*
 - *Continuous Bag of Words (CBoW)*
- *Both of these models learn dense vector representation of words, based on the words that surround them (ie, their context)*
- *Skip-Gram model predicts context (surrounding) words given the current word*
- *Continuous Bag of Words model predicts the current word based on several surrounding words*

Word2Vec (Continue)



CBOW



Skip-gram

Word2Vec (Continue)

Source Text

Training Samples

The quick brown fox jumps over the lazy dog. →

(the, quick)
(the, brown)

The quick brown fox jumps over the lazy dog. →

(quick, the)
(quick, brown)
(quick, fox)

The quick brown fox jumps over the lazy dog. →

(brown, the)
(brown, quick)
(brown, fox)
(brown, jumps)

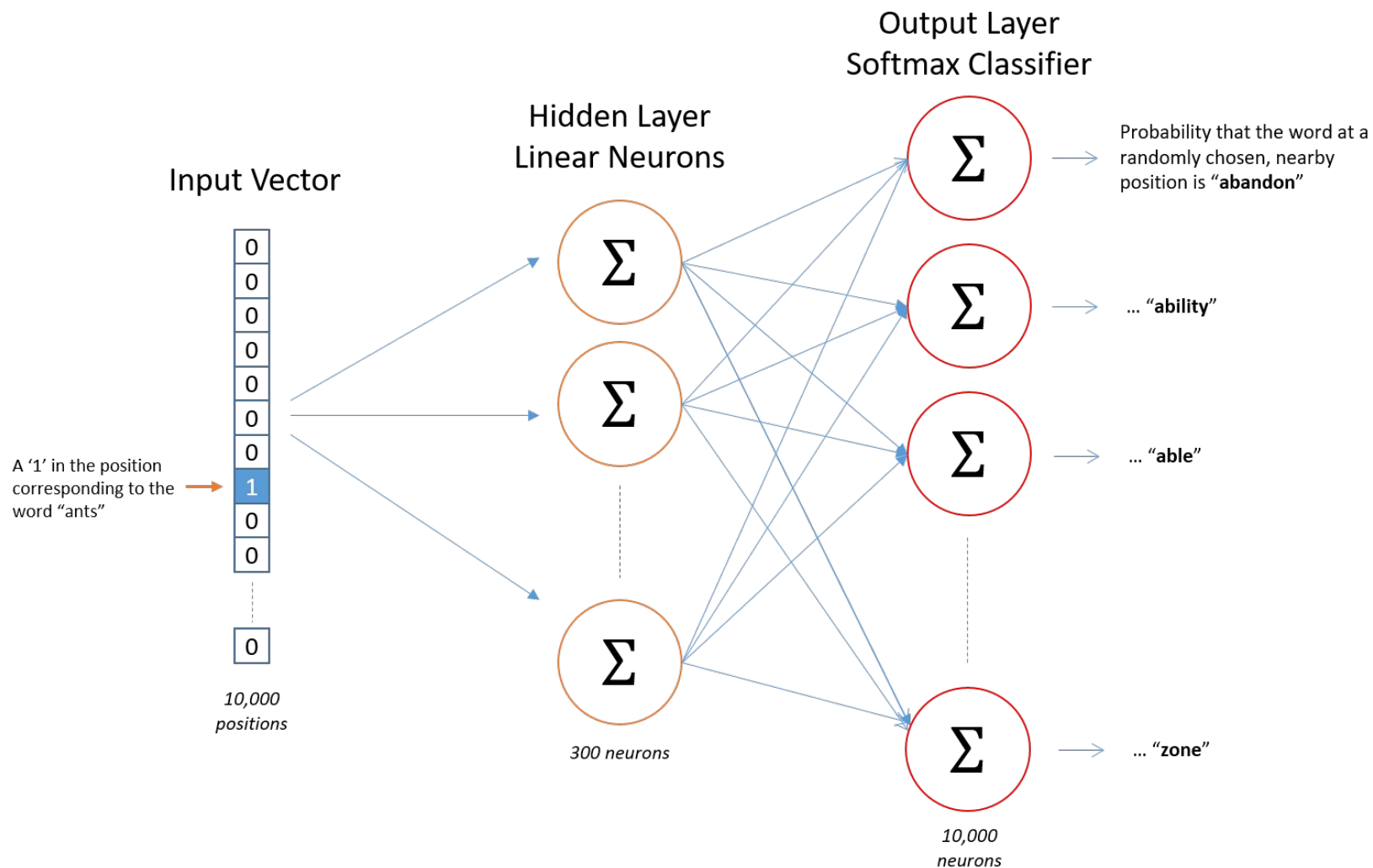
The quick brown fox jumps over the lazy dog. →

(fox, quick)
(fox, brown)
(fox, jumps)
(fox, over)

Word2Vec (Continue)

- *Word2Vec is a simple neural network with a single hidden layer*
- *This network train with raw text for specific task (language model), but the goal is actually just to learn the weights of the hidden layer*
- *The weights of hidden layer are actually the Word Vectors*
- *For learn Word Vectors with Word2Vec*
 - *Prepare training documents*
 - *Build a vocabulary of words from training documents (V unique words)*
 - *Represent each word as one hot vector (as input)*
 - *The output of the network have a same size as input (V)*

Word2Vec (Continue)

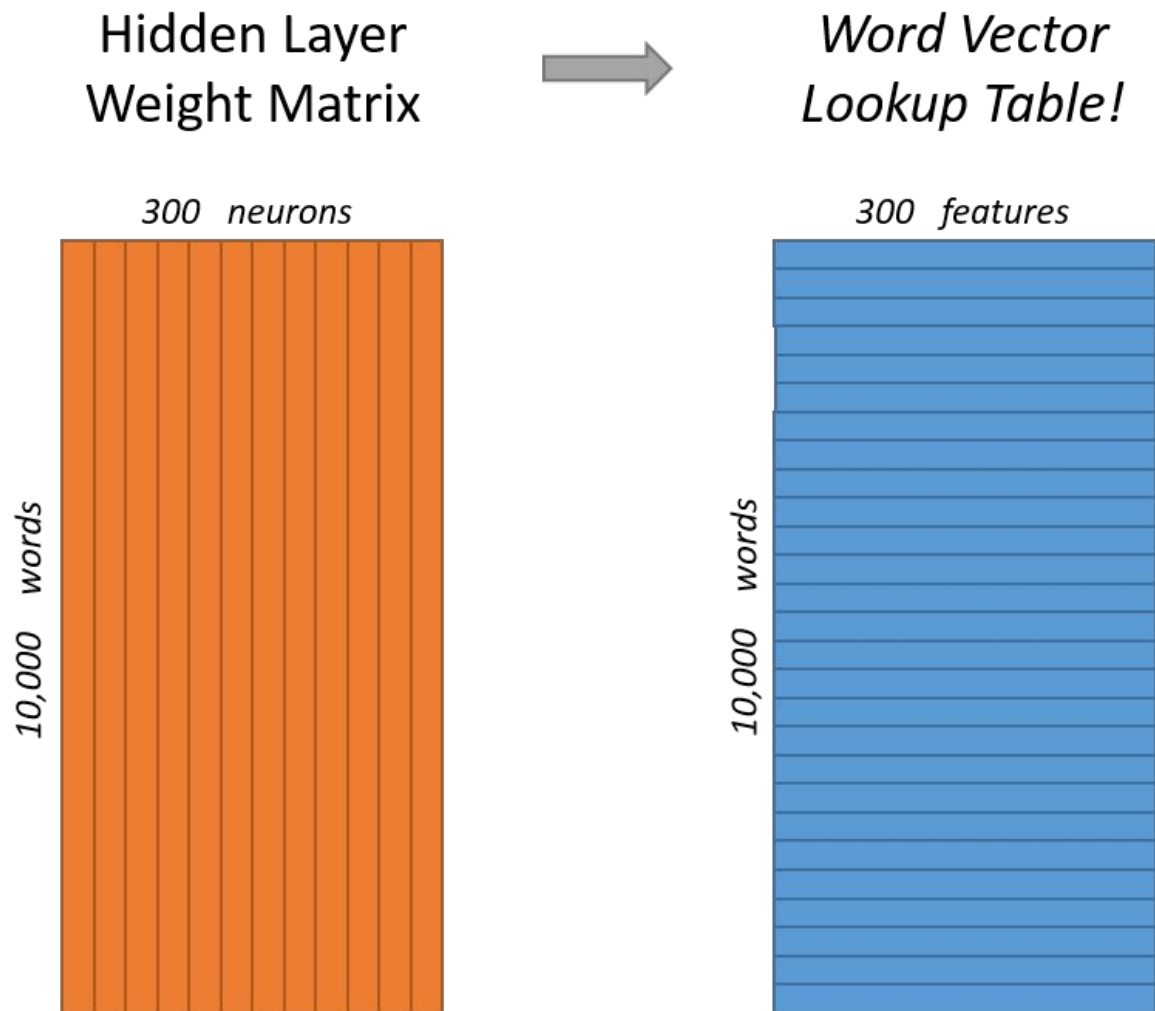


Word2Vec (Continue)

- *Hidden layer of this model is really just operating as a lookup table. The output of the hidden layer is just the “word vector” for the input word*

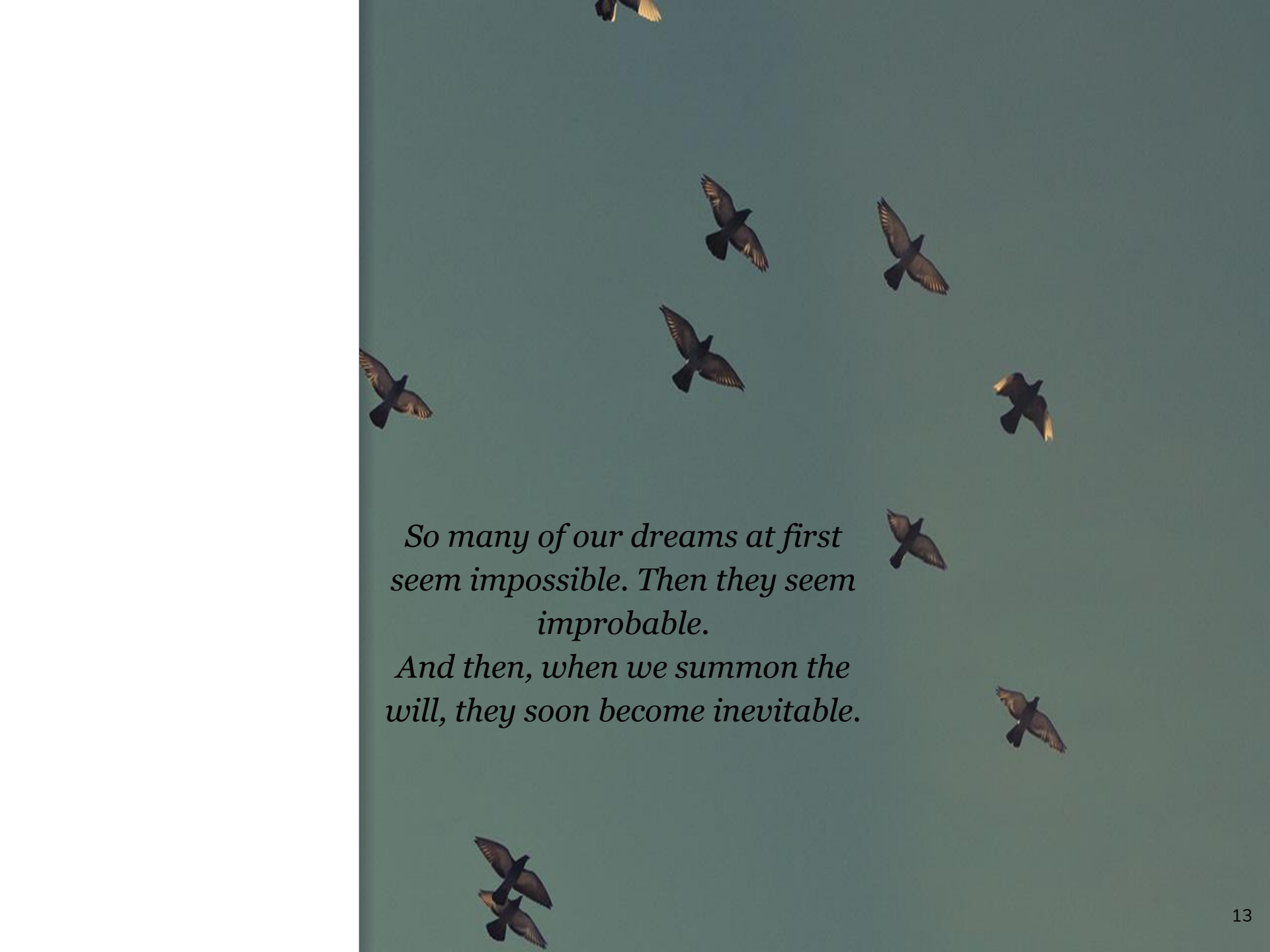
$$\begin{bmatrix} 0 & 0 & 0 & 1 & 0 \end{bmatrix} \times \begin{bmatrix} 17 & 24 & 1 \\ 23 & 5 & 7 \\ 4 & 6 & 13 \\ 10 & 12 & 19 \\ 11 & 18 & 25 \end{bmatrix} = \begin{bmatrix} 10 & 12 & 19 \end{bmatrix}$$

Word2Vec (Continue)



Word2Vec (Continue)

- *If two different words have very similar “contexts” (that is, what words are likely to appear around them - synonyms like “intelligent” and “smart” would have very similar contexts), the model needs to output very similar results for these two word.*
- *One way for the network to output similar context predictions for these two words is if the word vectors are similar.*
- *So, if two words have similar contexts, then the network is motivated to learn similar word vectors for these two words!*
- *Ta da!*



*So many of our dreams at first
seem impossible. Then they seem
improbable.*

*And then, when we summon the
will, they soon become inevitable.*