

# Formal Models of Language



Jon Dehdari

October 26, 2015

# Introduction

Hi!

# Formal Languages

- Once Upon a Time...

# Formal Languages

- Once Upon a Time...
- Mathematicians started to think about language...

# Formal Languages

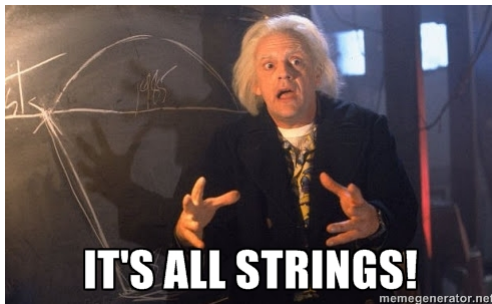
- Once Upon a Time...
- Mathematicians started to think about language...
- They used ideas from logic to represent linguistic objects...

# Formal Languages

- Once Upon a Time...
- Mathematicians started to think about language...
- They used ideas from logic to represent linguistic objects...
- They had a craaaazy idea...

# Formal Languages

- Once Upon a Time...
- Mathematicians started to think about language...
- They used ideas from logic to represent linguistic objects...
- They had a craaaazy idea...



# Strings

## What's a String?

- A **string** in this context is just a sequence of words



# Strings

## What's a String?

- A **string** in this context is just a sequence of words
- A **formal language** ( $L$ ) is a subset of all the possible strings

# Strings

## What's a String?

- A **string** in this context is just a sequence of words
- A **formal language** ( $L$ ) is a subset of all the possible strings
- An **vocabulary** ( $\Sigma$ , also sometimes called *alphabet*) here is a set of all the words in the language

# Strings

## What's a String?

- A **string** in this context is just a sequence of words
- A **formal language** ( $L$ ) is a subset of all the possible strings
- An **vocabulary** ( $\Sigma$ , also sometimes called *alphabet*) here is a set of all the words in the language
- Words here don't need to correspond to words used for natural languages

# Strings

## What's a String?

- A **string** in this context is just a sequence of words
- A **formal language** ( $L$ ) is a subset of all the possible strings
- An **vocabulary** ( $\Sigma$ , also sometimes called *alphabet*) here is a set of all the words in the language
- Words here don't need to correspond to words used for natural languages
- For example, this set:

{ 😊, 🌳, 🧙 } }

is a perfectly valid vocabulary for a formal language.

# Strings

## What's a String?

- A **string** in this context is just a sequence of words
- A **formal language** ( $L$ ) is a subset of all the possible strings
- An **vocabulary** ( $\Sigma$ , also sometimes called *alphabet*) here is a set of all the words in the language
- Words here don't need to correspond to words used for natural languages
- For example, this set:

{ , ,  }

is a perfectly valid vocabulary for a formal language. But we usually use boring symbols like  $\{a, b, c\}$

# Strings

## What's a String?

- A **string** in this context is just a sequence of words
- A **formal language** ( $L$ ) is a subset of all the possible strings
- An **vocabulary** ( $\Sigma$ , also sometimes called *alphabet*) here is a set of all the words in the language
- Words here don't need to correspond to words used for natural languages
- For example, this set:

{ , ,  }

is a perfectly valid vocabulary for a formal language. But we usually use boring symbols like  $\{a, b, c\}$

- (Similar to musical/poetic form analysis)

# Formal Grammar

- A formal grammar is a way of telling what a valid string is in a formal language
- Formal grammars can also **generate** valid strings

# Formal Grammar

- A formal grammar is a way of telling what a valid string is in a formal language
- Formal grammars can also **generate** valid strings
- If two different grammars can generate/accept the same formal languages, then they have the same **weak generative capacity**



# Formal Grammar

- A formal grammar is a way of telling what a valid string is in a formal language
- Formal grammars can also **generate** valid strings
- If two different grammars can generate/accept the same formal languages, then they have the same **weak generative capacity**
- If two different grammars can generate/accept the same structures as well, then they have the same **strong generative capacity**

# Formal Language Hierarchy

	Formal Language
	Non-Turing-acceptable
0:	<b>Recursively enumerable</b>
	Recursive/ Decidable
1:	Context-sensitive
	Indexed
	<b>Mildly context-sensitive</b>
2:	<b>Context-free</b>
	<b>Deterministic context-free</b>
3:	<b>Regular</b>
	<b>Finite</b>

## Formal Language Hierarchy

	Formal Language
	Non-Turing-acceptable
0:	<b>Recursively enumerable</b>
	Recursive/ Decidable
1:	Context-sensitive
	Indexed
	<b>Mildly context-sensitive</b>
2:	<b>Context-free</b>
	<b>Deterministic context-free</b>
3:	<b>Regular</b>
	<b>Finite</b>

This is extended from the older *Chomsky hierarchy*.

## Formal Language Hierarchy

	Formal Language
	Non-Turing-acceptable
0:	<b>Recursively enumerable</b>
	Recursive/ Decidable
1:	Context-sensitive
	Indexed
	<b>Mildly context-sensitive</b>
2:	<b>Context-free</b>
	<b>Deterministic context-free</b>
3:	<b>Regular</b>
	<b>Finite</b>

This is extended from the older *Chomsky hierarchy*. We'll discuss the ones in boldface, as they're relevant to natural languages.

## Why is this Stuff Relevant??

- Knowing what types of formal languages a grammar/automaton can generate & accept will give you an idea of what phenomena in natural languages that they can handle

## Why is this Stuff Relevant??

- Knowing what types of formal languages a grammar/automaton can generate & accept will give you an idea of what phenomena in natural languages that they can handle
- For example: long-distance dependencies, complex reordering in machine translation, reduplication, etc.

## Why is this Stuff Relevant??

- Knowing what types of formal languages a grammar/automaton can generate & accept will give you an idea of what phenomena in natural languages that they can handle
- For example: long-distance dependencies, complex reordering in machine translation, reduplication, etc.
- You can also get an idea of how fast or slow it will take for a computer (or human) to process sequential stuff (like natural language!)

# Finite Languages

- In a finite language, there are a finite (ie not infinite) number of valid *sentences*.
- Time: constant (through hash-table lookup)
- Memory: constant (duh)



# Finite Languages

- In a finite language, there are a finite (ie not infinite) number of valid *sentences*.
- Time: constant (through hash-table lookup)
- Memory: constant (duh)
- For natural language, this would correspond to having a finite number of possible sentences

## Are Natural Languages Finite??!!

- It sounds crazy to think that you could ever list all of the possible sentences of a natural language

## Are Natural Languages Finite??!

- It sounds crazy to think that you could ever list all of the possible sentences of a natural language
- Really, really crazy

## Are Natural Languages Finite??!!

- It sounds crazy to think that you could ever list all of the possible sentences of a natural language
- Really, really crazy
- But...

## Are Natural Languages Finite??!!

- It sounds crazy to think that you could ever list all of the possible sentences of a natural language
- Really, really crazy
- But...
- There's a big difference between a really large number and infinity

## Are Natural Languages Finite??!!

- It sounds crazy to think that you could ever list all of the possible sentences of a natural language
- Really, really crazy
- But...
- There's a big difference between a really large number and infinity
- If a natural language has a vocabulary of, say, 100 million words ...

## Are Natural Languages Finite??!!

- It sounds crazy to think that you could ever list all of the possible sentences of a natural language
- Really, really crazy
- But...
- There's a big difference between a really large number and infinity
- If a natural language has a vocabulary of, say, 100 million words ...
- And a sentence can have, say, up to 10,000 words in it, ...

## Are Natural Languages Finite??!!

- It sounds crazy to think that you could ever list all of the possible sentences of a natural language
- Really, really crazy
- But...
- There's a big difference between a really large number and infinity
- If a natural language has a vocabulary of, say, 100 million words ...
- And a sentence can have, say, up to 10,000 words in it, ...
- Then there would be  $10^{80,000}$  possible sentences



## Are Natural Languages Finite??!!

- It sounds crazy to think that you could ever list all of the possible sentences of a natural language
- Really, really crazy
- But...
- There's a big difference between a really large number and infinity
- If a natural language has a vocabulary of, say, 100 million words ...
- And a sentence can have, say, up to 10,000 words in it, ...
- Then there would be  $10^{80,000}$  possible sentences
- This number sounds way too big to be practical for either humans or computers to deal with!

## Are Natural Languages Finite??!!

- It sounds crazy to think that you could ever list all of the possible sentences of a natural language
- Really, really crazy
- But...
- There's a big difference between a really large number and infinity
- If a natural language has a vocabulary of, say, 100 million words ...
- And a sentence can have, say, up to 10,000 words in it, ...
- Then there would be  $10^{80,000}$  possible sentences
- This number sounds way too big to be practical for either humans or computers to deal with!
- But it's much smaller than infinity.

## Are Natural Languages Finite??!!

- It sounds crazy to think that you could ever list all of the possible sentences of a natural language
- Really, really crazy
- But...
- There's a big difference between a really large number and infinity
- If a natural language has a vocabulary of, say, 100 million words ...
- And a sentence can have, say, up to 10,000 words in it, ...
- Then there would be  $10^{80,000}$  possible sentences
- This number sounds way too big to be practical for either humans or computers to deal with!
- But it's much smaller than infinity.
- Much much smaller.

# Are Natural Languages Finite??!

- It sounds crazy to think that you could ever list all of the possible sentences of a natural language
- Really, really crazy
- But...
- There's a big difference between a really large number and infinity
- If a natural language has a vocabulary of, say, 100 million words ...
- And a sentence can have, say, up to 10,000 words in it, ...
- Then there would be  $10^{80,000}$  possible sentences
- This number sounds way too big to be practical for either humans or computers to deal with!
- But it's much smaller than infinity.
- Much much smaller.
- (There's more discussion on the interwebs if you're interested)

## Regular Languages

- Ok, so maybe for now it's too difficult to list all possible sentences
- Let's assume that the vocabulary ( $\Sigma$ ) is still fixed (or finite), but we can generate an infinite number of sentences from this fixed vocab
- Regular grammars have a fixed-length history, so they're limited in the types of long-distance phenomena they can handle

# Regular Languages

- Ok, so maybe for now it's too difficult to list all possible sentences
- Let's assume that the vocabulary ( $\Sigma$ ) is still fixed (or finite), but we can generate an infinite number of sentences from this fixed vocab
- Regular grammars have a fixed-length history, so they're limited in the types of long-distance phenomena they can handle
- For example: **a a' b b' c c'**

# Regular Languages

- Ok, so maybe for now it's too difficult to list all possible sentences
- Let's assume that the vocabulary ( $\Sigma$ ) is still fixed (or finite), but we can generate an infinite number of sentences from this fixed vocab
- Regular grammars have a fixed-length history, so they're limited in the types of long-distance phenomena they can handle
- For example: **a a' b b' c c'**
- Processing regular languages can be done in linear time ( $\mathcal{O}(n)$ ), with a constant size of memory ( $\mathcal{O}(1)$ )

# Deterministic Context-Free Languages

- Deterministic context-free (DCF) languages include longer-distance phenomena
- DCF grammars have a full-length history, as long as there's no ambiguity (ie. it can't backtrack)



# Deterministic Context-Free Languages

- Deterministic context-free (DCF) languages include longer-distance phenomena
- DCF grammars have a full-length history, as long as there's no ambiguity (ie. it can't backtrack)
- Processing DCF languages can be done in linear time ( $\mathcal{O}(n)$ ), with linear memory usage ( $\mathcal{O}(n)$ )

# Context-Free Languages

- Context-free languages include phenomena like center embedding
- For example: **a b c c' b' a'**

## Context-Free Languages

- Context-free languages include phenomena like center embedding
- For example: **a b c c' b' a'**
- Context-free grammars have a full-length history, and they can backtrack for ambiguous sentences

## Context-Free Languages

- Context-free languages include phenomena like center embedding
- For example: **a b c c' b' a'**
- Context-free grammars have a full-length history, and they can backtrack for ambiguous sentences
- Processing DCF languages can be done in about cubic time ( $\mathcal{O}(n^3)$ ), with linear memory usage ( $\mathcal{O}(n)$ )

## Mildly Context-Sensitive Languages

- Mildly context-sensitive (MCS) languages include phenomena like reduplication and cross-serial dependencies.
- Example: **a b c a' b' c'**

## Mildly Context-Sensitive Languages

- Mildly context-sensitive (MCS) languages include phenomena like reduplication and cross-serial dependencies.
- Example: **a b c a' b' c'**

...das mer d'chind                      em Hans    es huus      lönd hälfe aastriiche  
...that we   the children-ACC Hans-DAT house-ACC let    help   paint



'...that we let the children help Hans paint the house'

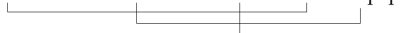
## Mildly Context-Sensitive Languages

- Mildly context-sensitive (MCS) languages include phenomena like reduplication and cross-serial dependencies.

- Example: **a b c a' b' c'**

...das mer d'chind                      em Hans    es huus      lönd hälfe aastriiche

...that we   the children-ACC Hans-DAT house-ACC let    help   paint



'...that we let the children help Hans paint the house'


- Processing MCS languages can be done in about  $\mathcal{O}(n^6)$  time, with quadratic memory usage ( $\mathcal{O}(n^2)$ )

## Mildly Context-Sensitive Languages

- Mildly context-sensitive (MCS) languages include phenomena like reduplication and cross-serial dependencies.

- Example: **a b c a' b' c'**

...das mer d'chind                      em Hans      es huus      lönd hälfe aastriche  
...that we   the children-ACC Hans-DAT house-ACC let   help   paint



'...that we let the children help Hans paint the house'

- Processing MCS languages can be done in about  $\mathcal{O}(n^6)$  time, with quadratic memory usage ( $\mathcal{O}(n^2)$ )
- Some grammar formalisms that can handle MCS languages include:
  - Tree Adjoining Grammar (TAG)
  - Combinatory Categorical Grammar (CCG)
  - Linear Indexed Grammars (LIG)
  - Head Grammars (HG)



# Recursively Enumerable Languages

- Recursively enumerable languages allow any string that a computer (or equivalent device) can generate/accept
- There's no guarantee that the computer will ever stop processing the sentence
- Essentially any word can occur in any place in the sentence

# Recursively Enumerable Languages

- Recursively enumerable languages allow any string that a computer (or equivalent device) can generate/accept
- There's no guarantee that the computer will ever stop processing the sentence
- Essentially any word can occur in any place in the sentence
- Some grammar formalisms that allow recursively enumerable languages include:
  - Chomskyan grammars (due to transformations / moves)
  - Lexical Functional Grammar (LFG)
  - Head-driven Phrase Structure Grammar (HPSG)

# Recursively Enumerable Languages

- Recursively enumerable languages allow any string that a computer (or equivalent device) can generate/accept
- There's no guarantee that the computer will ever stop processing the sentence
- Essentially any word can occur in any place in the sentence
- Some grammar formalisms that allow recursively enumerable languages include:
  - Chomskyan grammars (due to transformations / moves)
  - Lexical Functional Grammar (LFG)
  - Head-driven Phrase Structure Grammar (HPSG)
- Note that these grammar formalisms can place some restrictions on word order, but they still accept/generate recursively enumerable languages.

# Recursively Enumerable Languages

- Recursively enumerable languages allow any string that a computer (or equivalent device) can generate/accept
- There's no guarantee that the computer will ever stop processing the sentence
- Essentially any word can occur in any place in the sentence
- Some grammar formalisms that allow recursively enumerable languages include:
  - Chomskyan grammars (due to transformations / moves)
  - Lexical Functional Grammar (LFG)
  - Head-driven Phrase Structure Grammar (HPSG)
- Note that these grammar formalisms can place some restrictions on word order, but they still accept/generate recursively enumerable languages. How is that so?

# Recursively Enumerable Languages

- Recursively enumerable languages allow any string that a computer (or equivalent device) can generate/accept
- There's no guarantee that the computer will ever stop processing the sentence
- Essentially any word can occur in any place in the sentence
- Some grammar formalisms that allow recursively enumerable languages include:
  - Chomskyan grammars (due to transformations / moves)
  - Lexical Functional Grammar (LFG)
  - Head-driven Phrase Structure Grammar (HPSG)
- Note that these grammar formalisms can place some restrictions on word order, but they still accept/generate recursively enumerable languages. How is that so? Additional grammar rules can work around such restrictions to accept/generate the string.