

Natural Language Processing and your Apps

Session 208

Vivek Kumar Rangarajan Sridhar, Software Engineering Manager
Doug Davidson, Senior Engineer

Goal

Goal



Goal

Natural language input

typed text

recognized handwriting

transcribed speech



Goal



Natural language output

typed text

recognized handwriting

transcribed speech

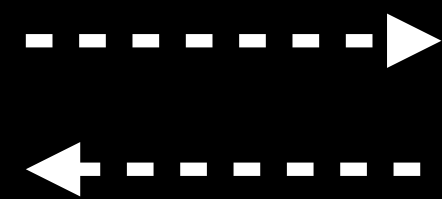
Goal

Natural language text

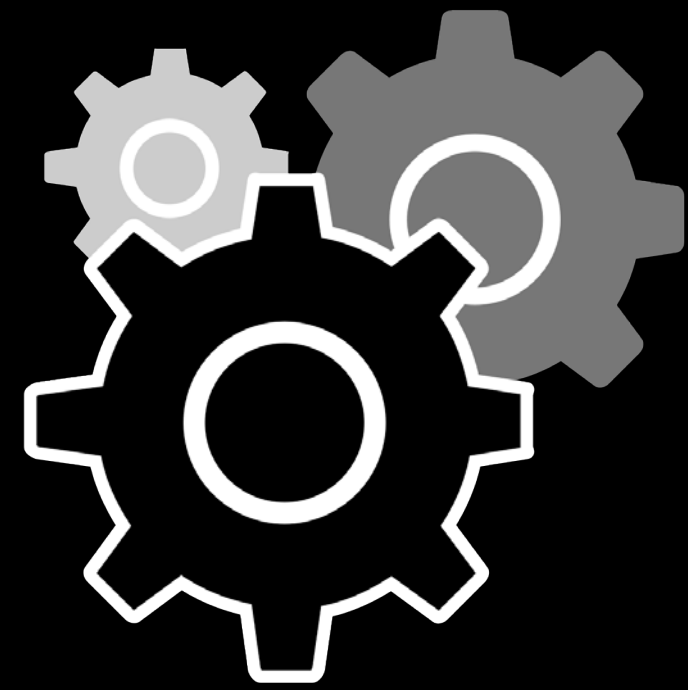
typed

recognized handwriting

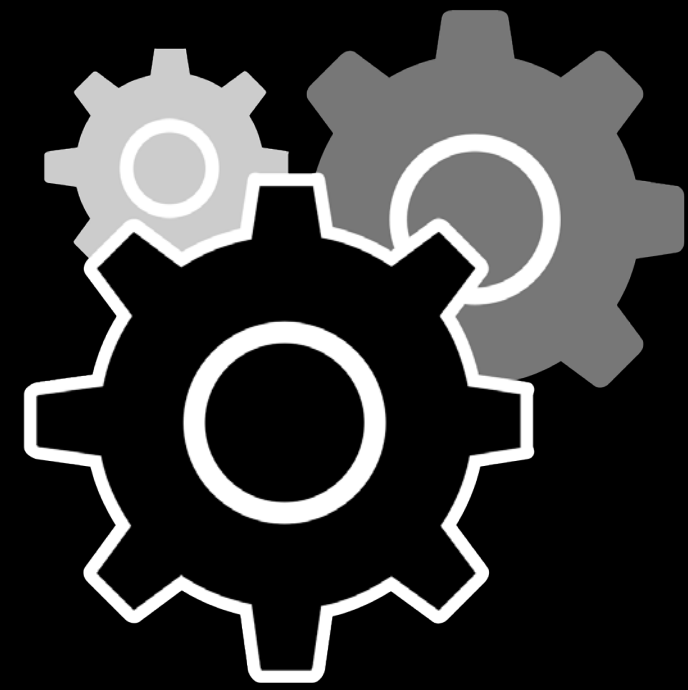
transcribed speech



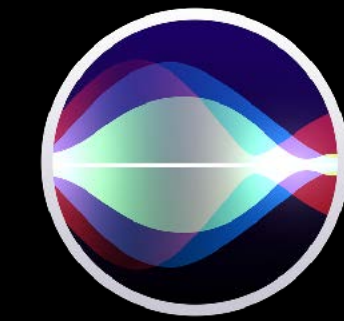
Confer intelligence

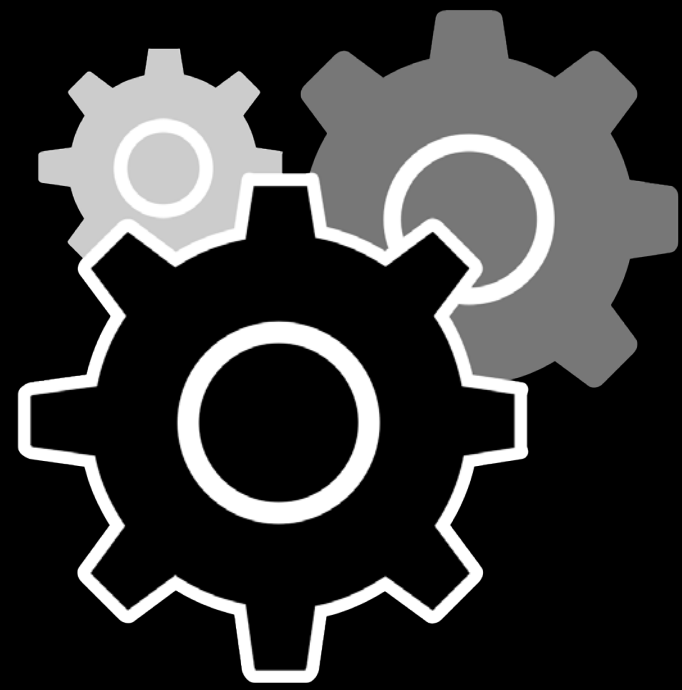


NLP APIs

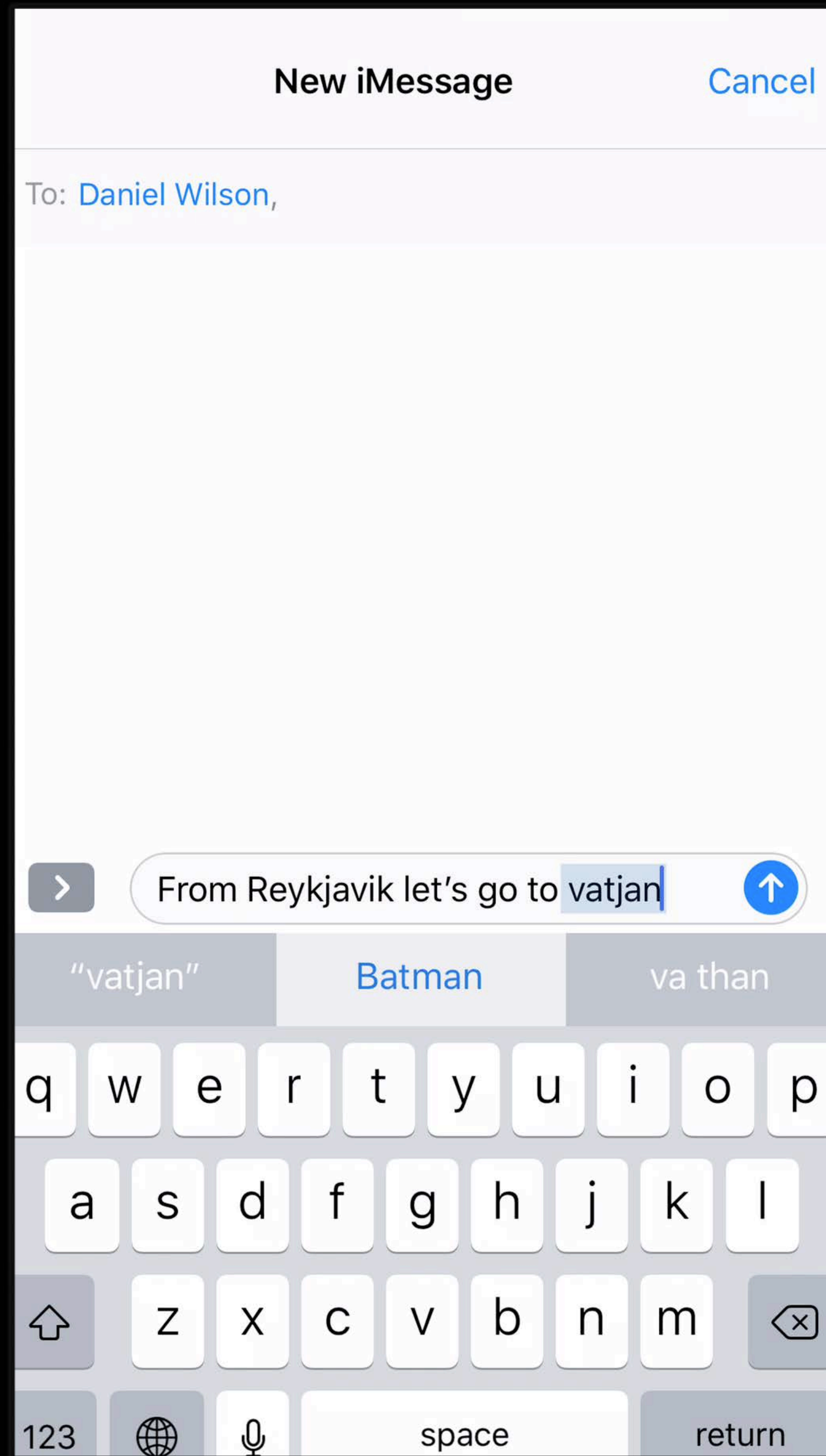


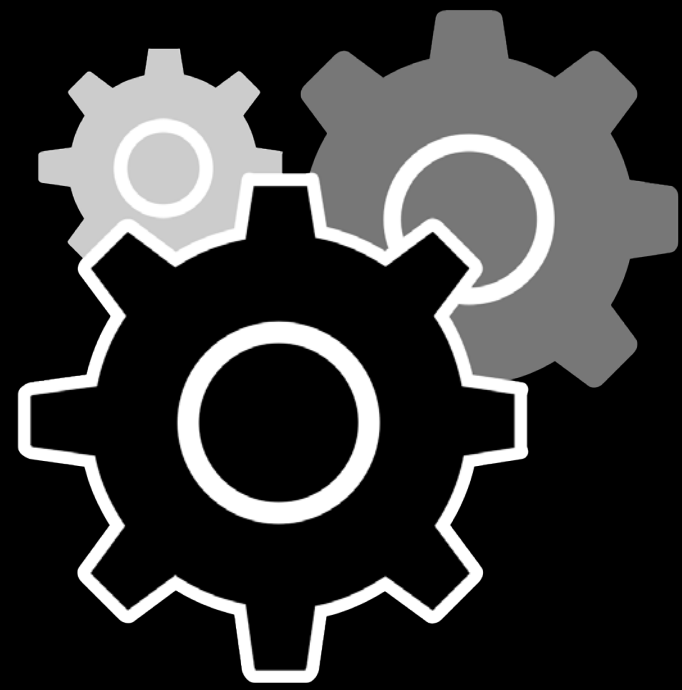
NLP APIs



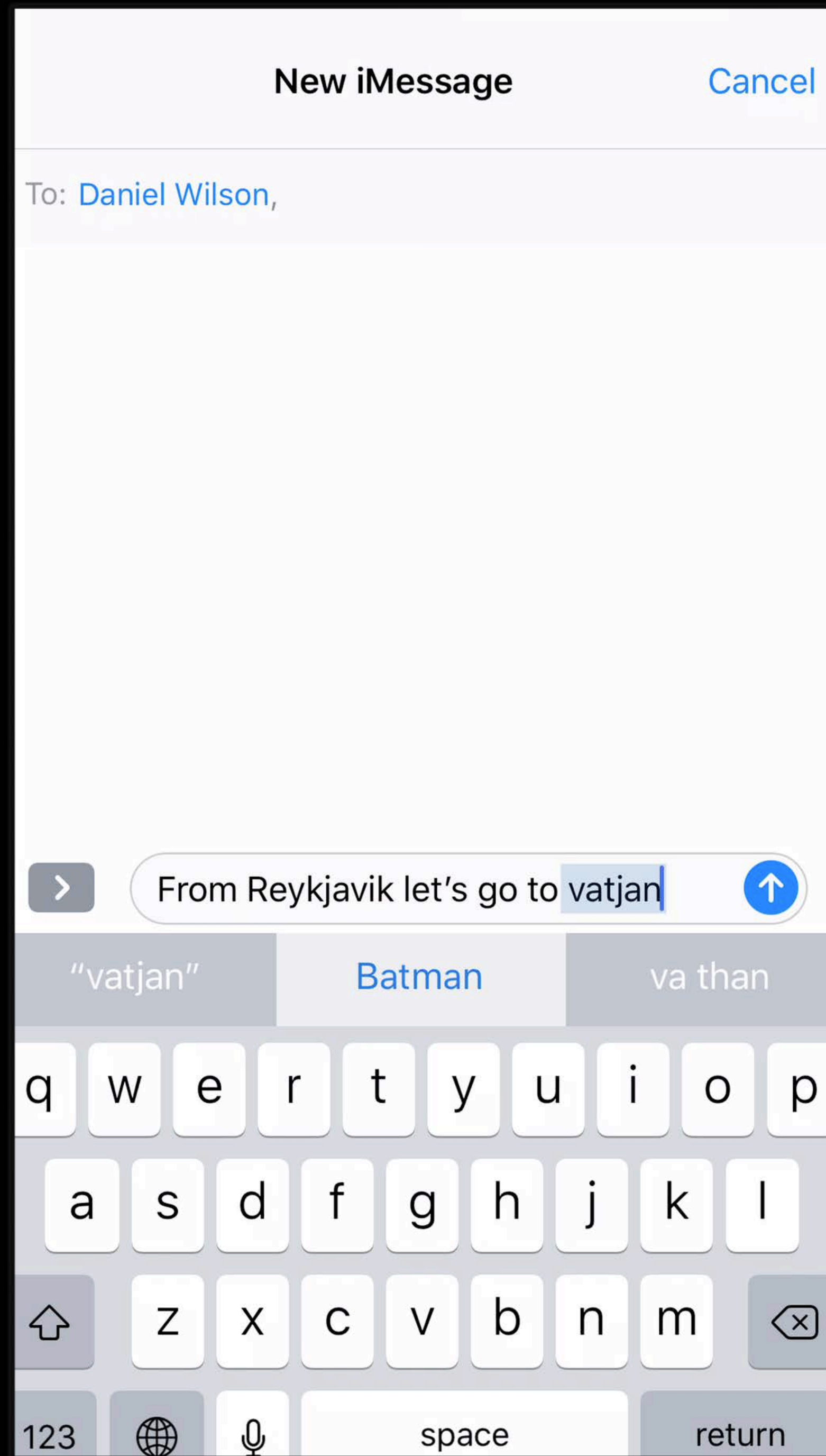


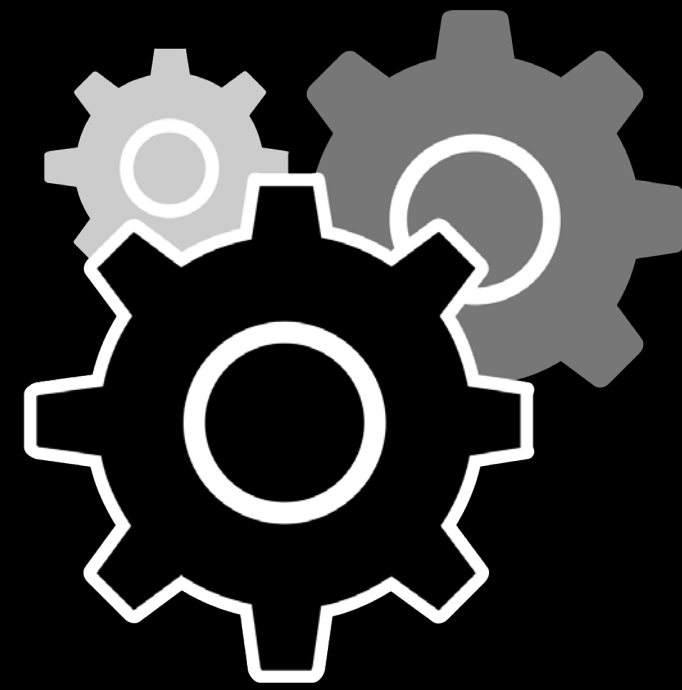
NLP APIs





NLP APIs





NLP APIs



Natural Language Processing

Natural Language Processing

Natural language text

typed

recognized handwriting

transcribed speech

Natural Language Processing

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recognized handwriting

transcribed speech



Processing

Natural Language Processing

Natural language text

typed
recognized handwriting
transcribed speech



Processing



Extract information
Confer intelligence

Natural Language Processing

Natural language text

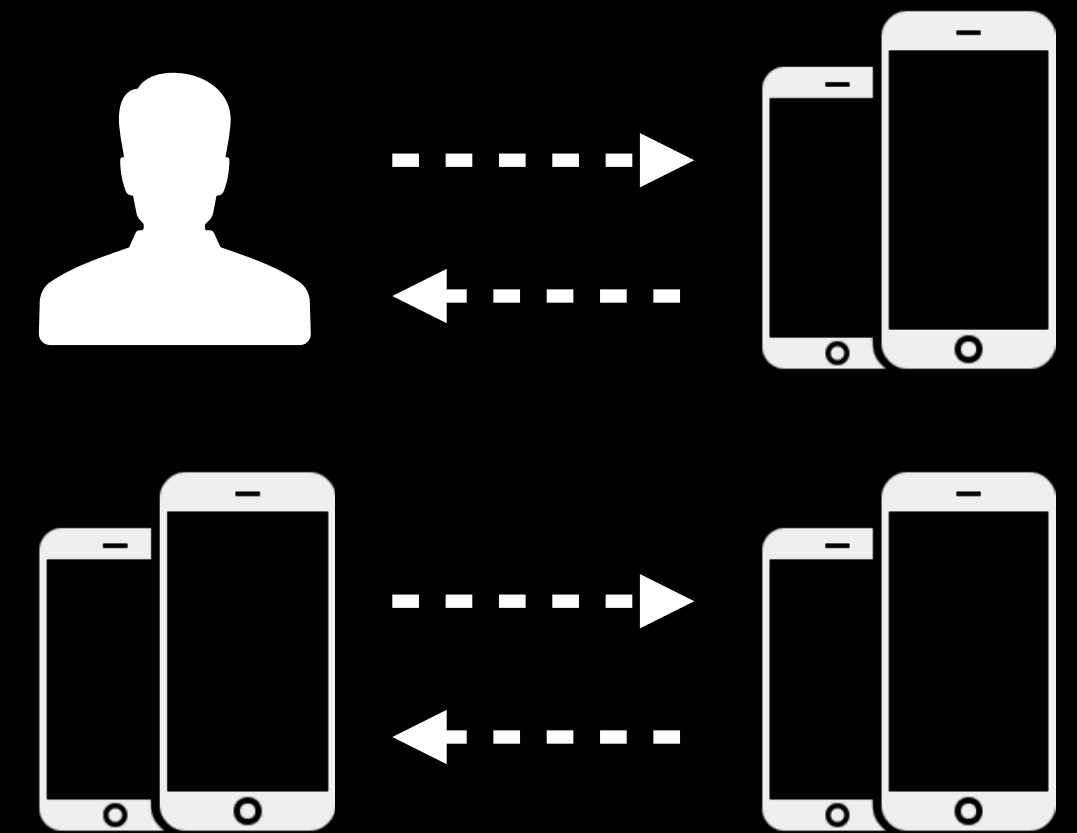
typed
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Processing



Extract information
Confer intelligence



Natural Language Processing

Natural language text

typed

recognized handwriting

transcribed speech



Confer intelligence

Natural Language Processing

Natural language text

typed
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transcribed speech



Detect language

Natural Language Processing

Natural language text

typed
recognized handwriting
transcribed speech



Detect language

Welcome to our talk on Natural Language Processing

欢迎参加我们关于自然语言处理的讲座

Bienvenidos a nuestra plática sobre Procesamiento de Lenguaje Natural

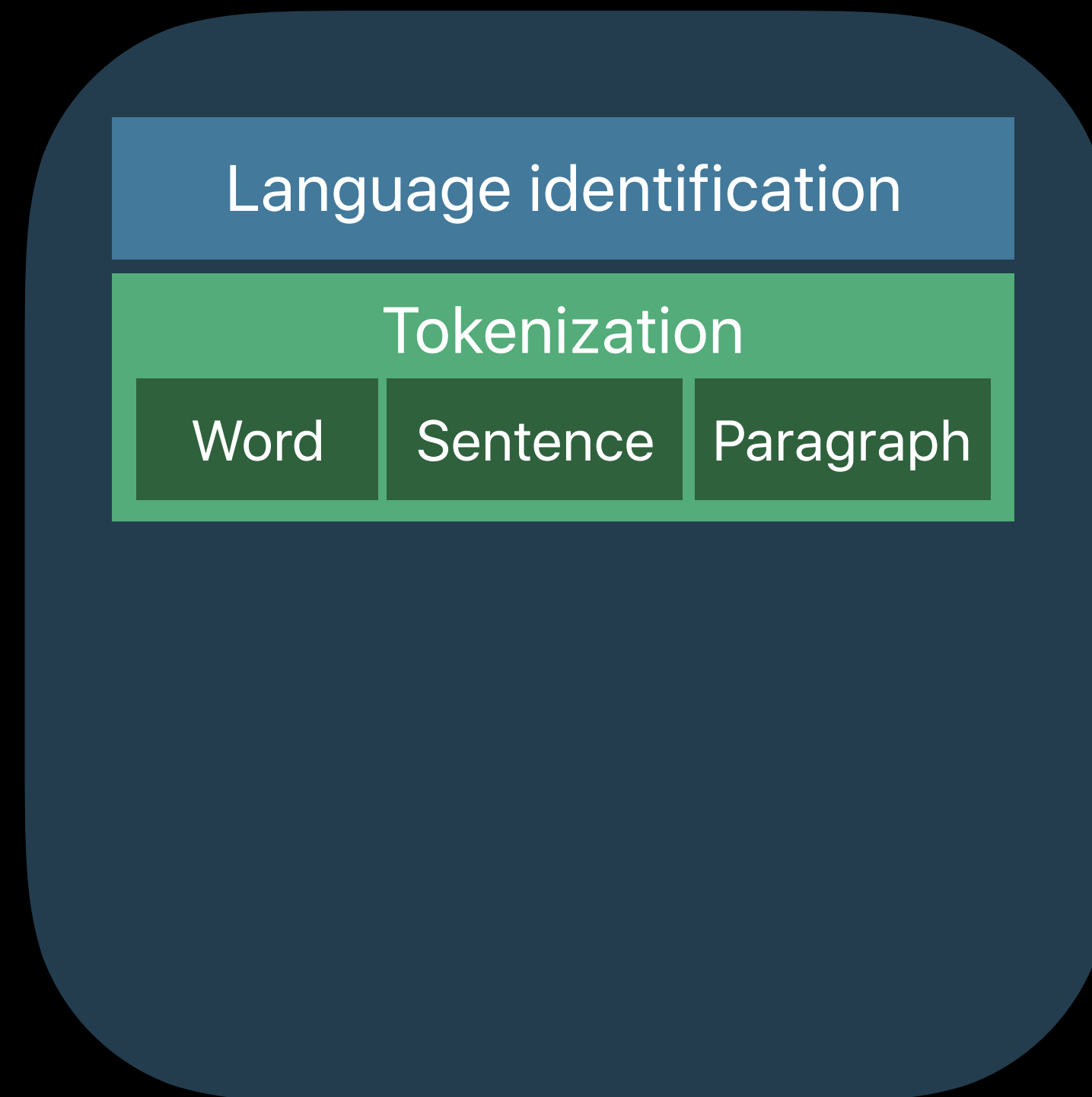
हमारी प्राकृतिक भाषा प्रसंस्करण भाषण में आपका स्वागत है

Willkommen zu unserem Vortrag über Verarbeitung natürlicher Sprache

Natural Language Processing

Natural language text

typed
recognized handwriting
transcribed speech

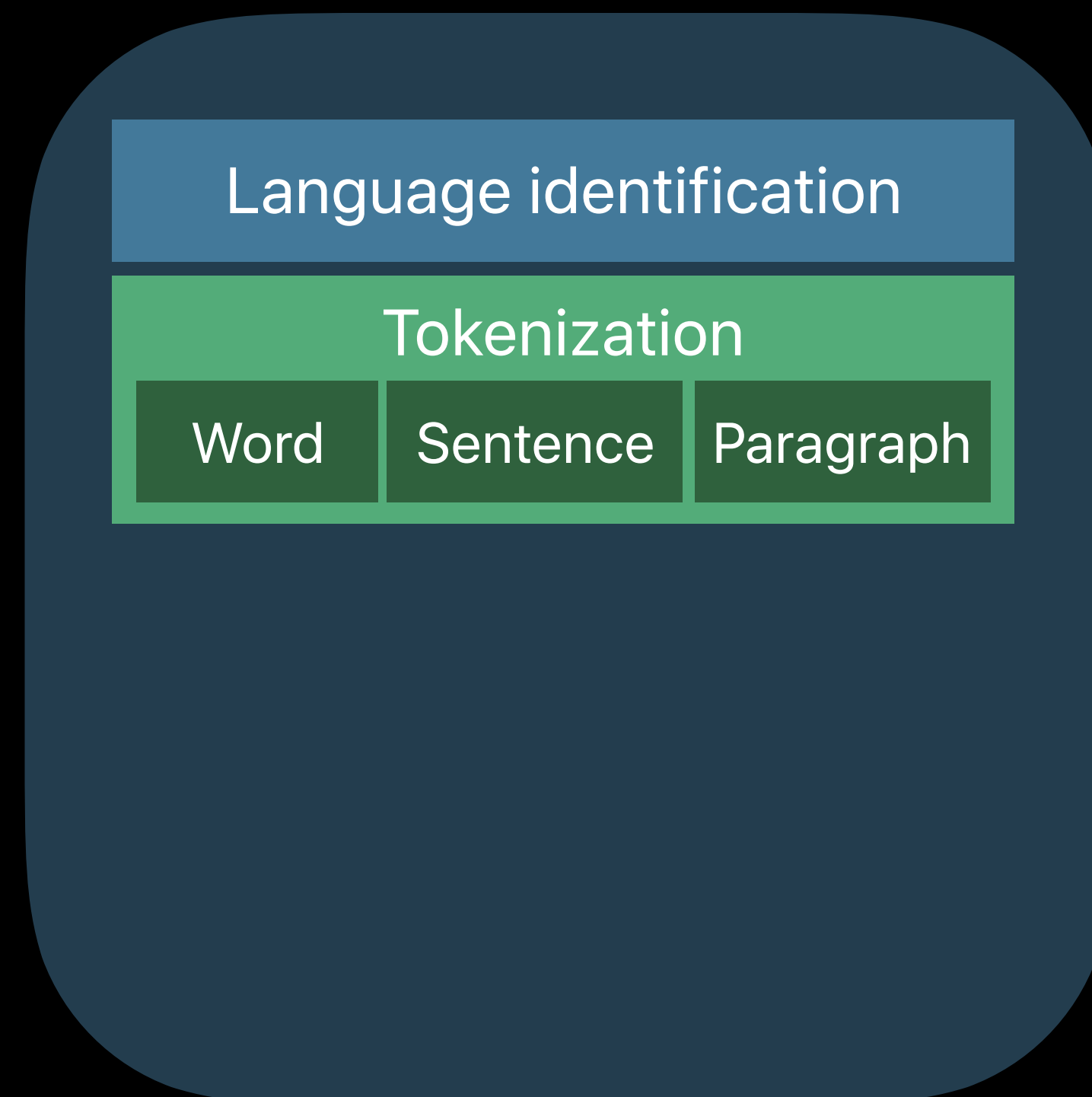


Tokenize text

Natural Language Processing

Natural language text

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transcribed speech



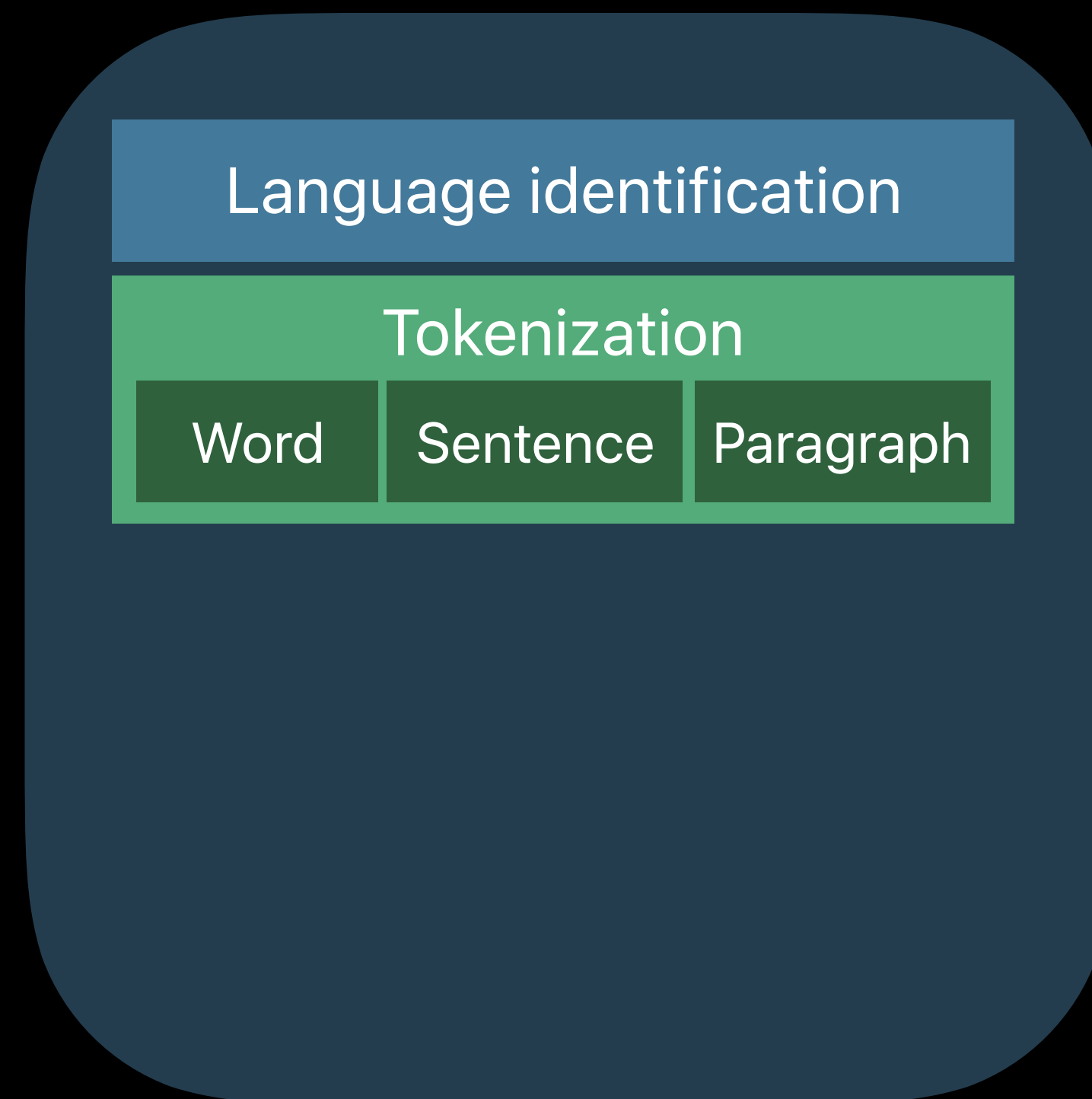
Tokenize text

Mr. Tim Cook presided over the earnings report of Apple Inc. on Tuesday.

Natural Language Processing

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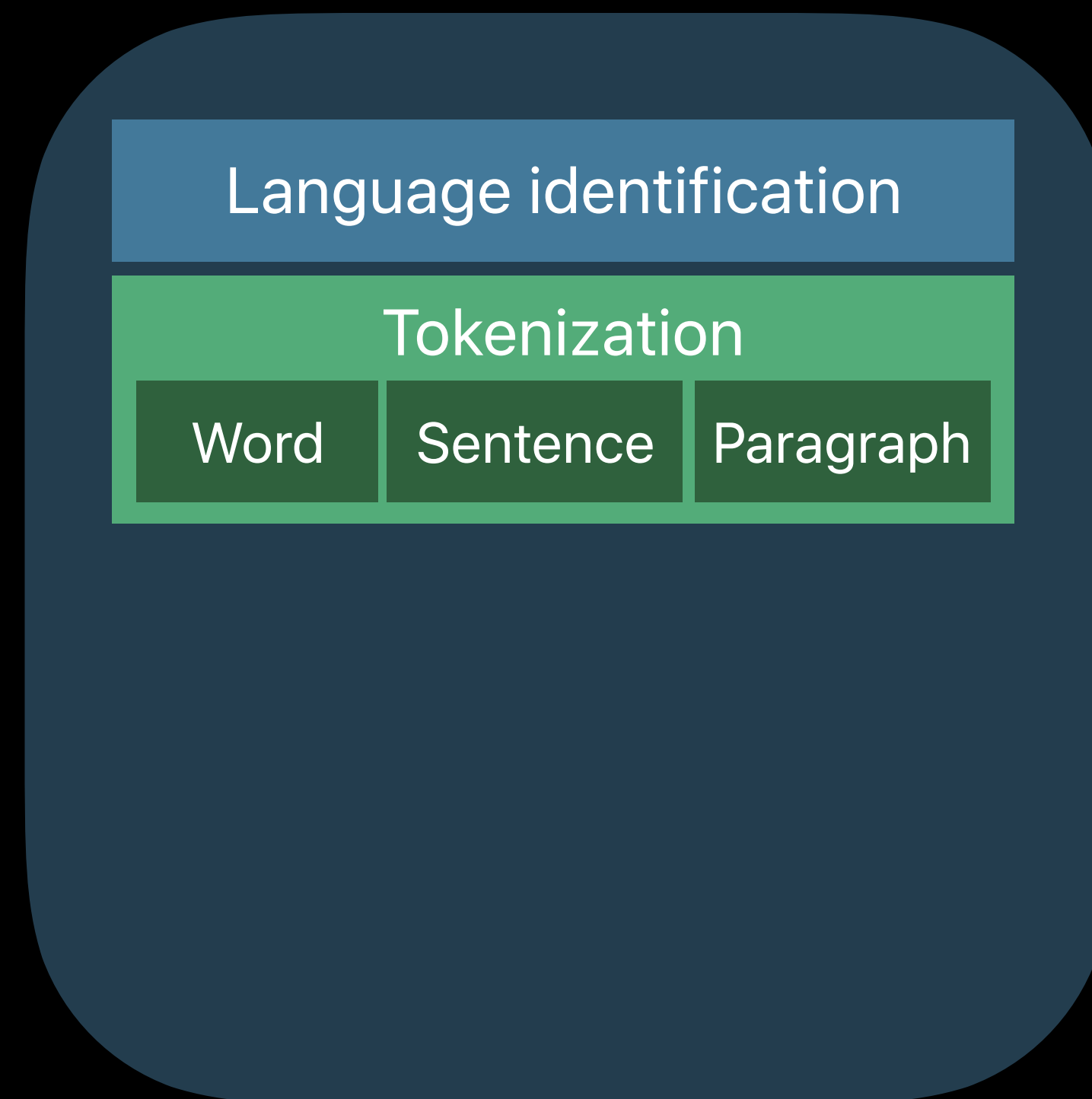
Tokenize text

星期二，蒂姆·库克先生主持了苹果公司的财报会议。

Natural Language Processing

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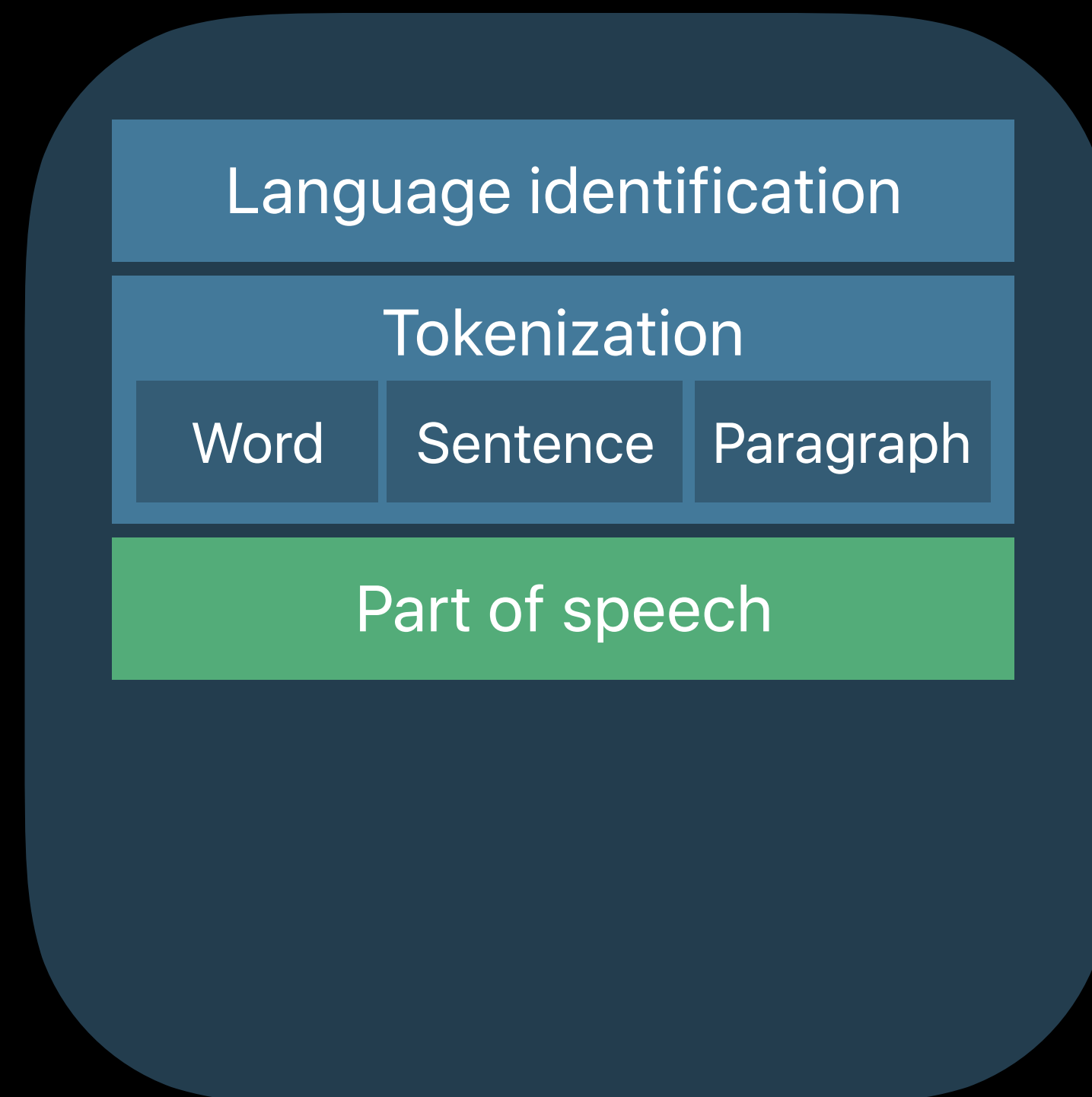
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Natural Language Processing

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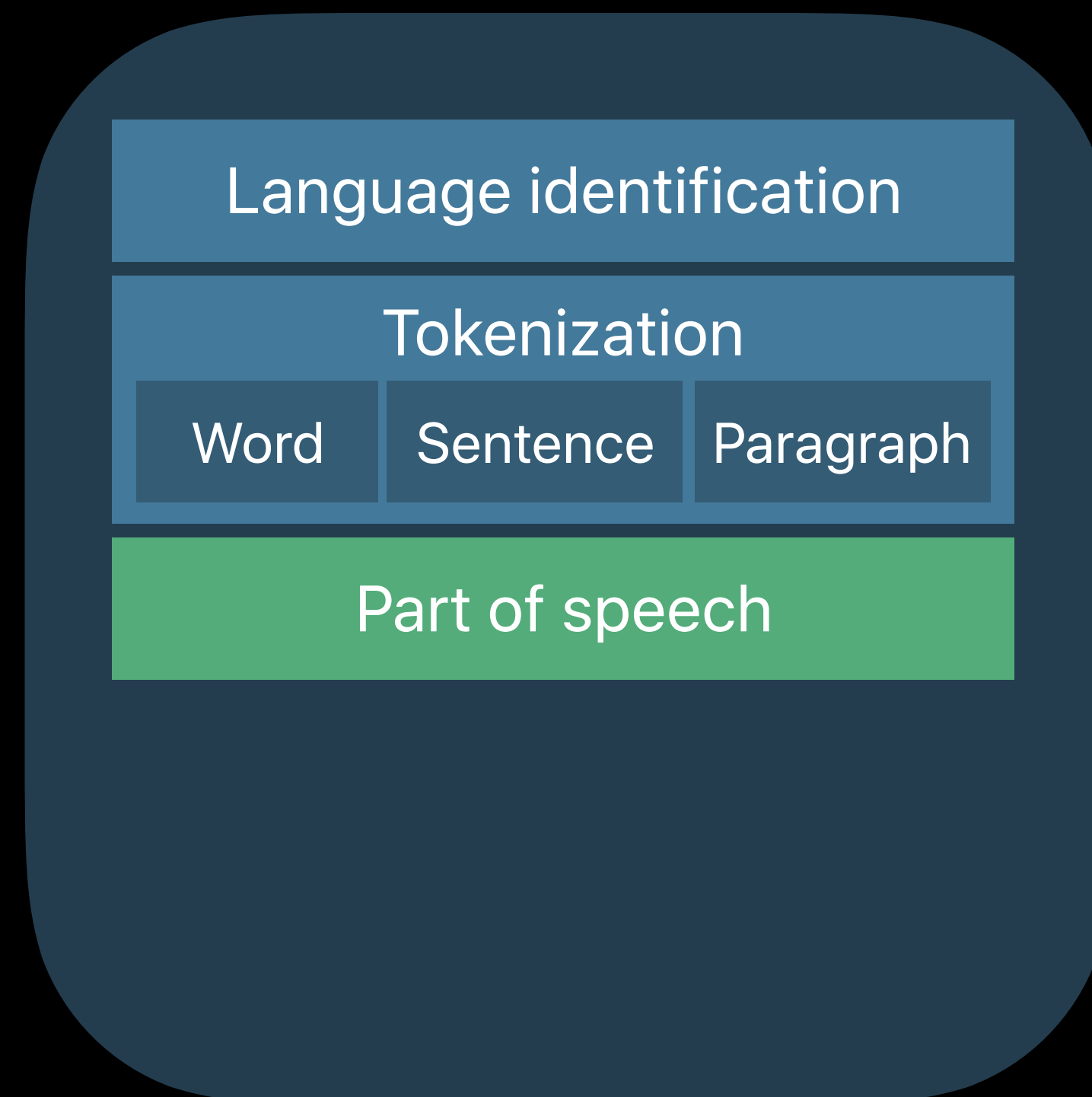


**Assign parts
of speech**

Natural Language Processing

Natural language text

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transcribed speech



Assign parts
of speech

Mr. Tim Cook presided over the earnings report of Apple Inc. on Tuesday .
Noun NNP NNP Verb PP DT Noun Noun PP Noun Noun PP Noun PUNCT

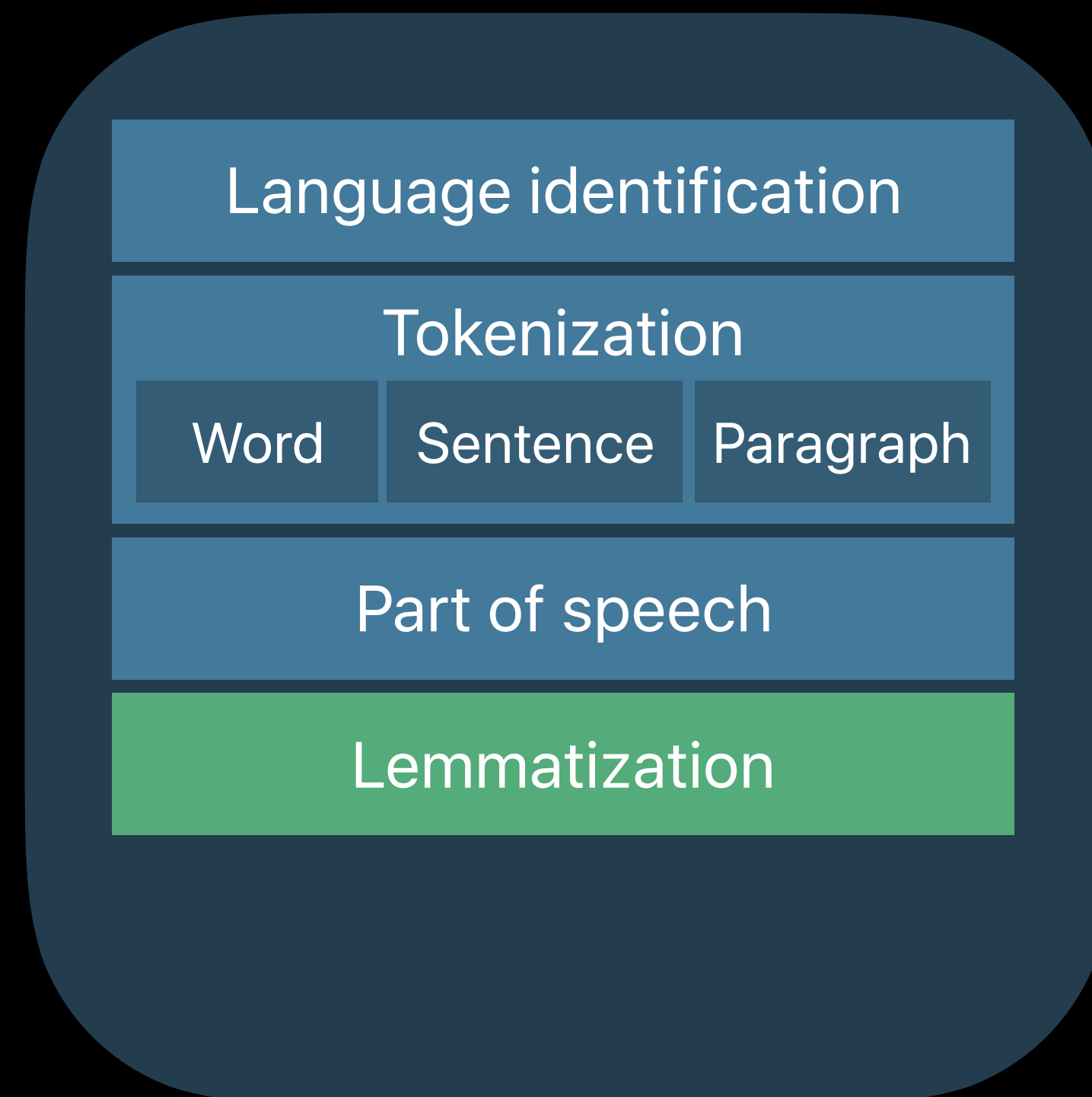
Natural Language Processing

Natural language text

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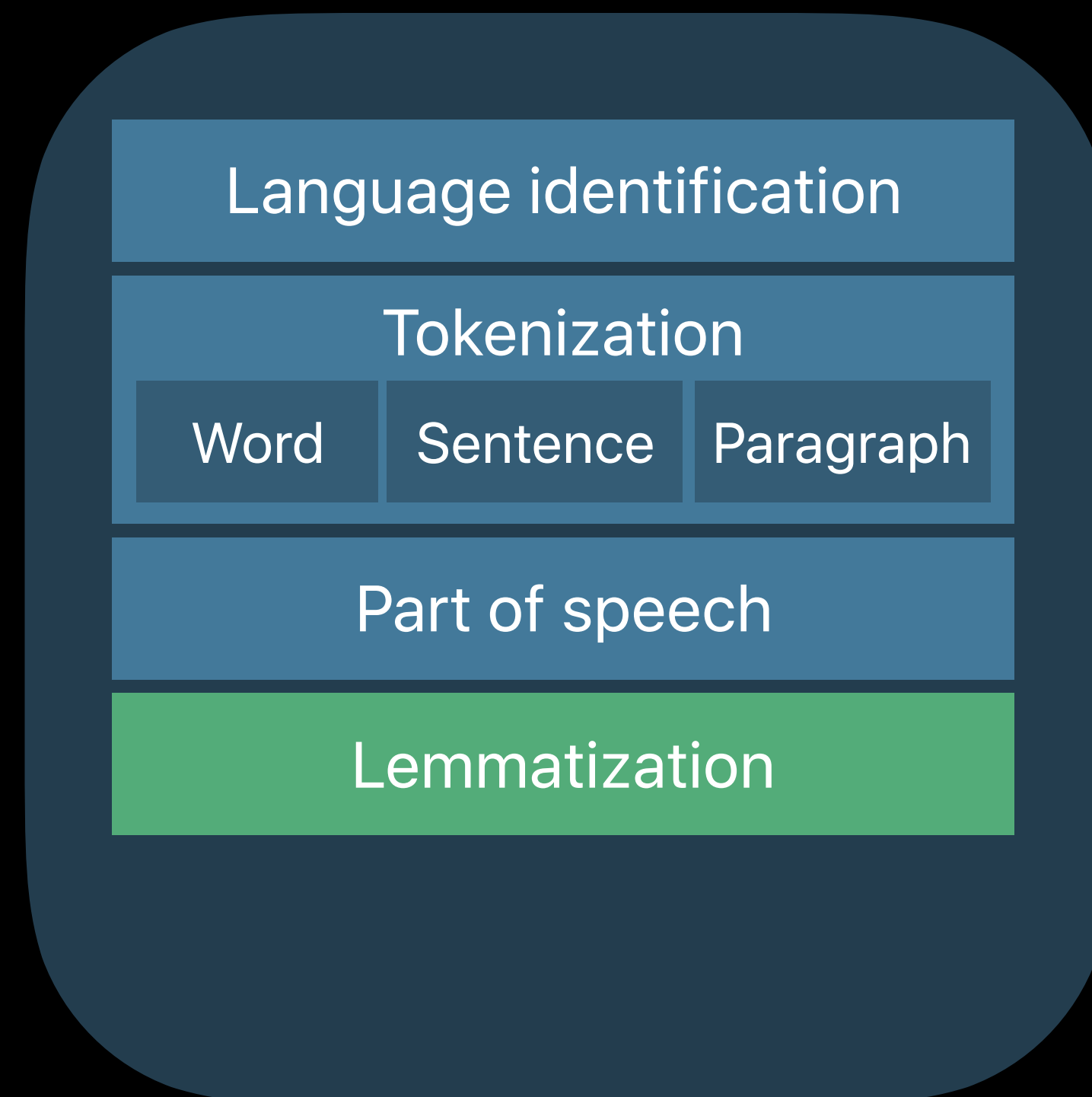


Lemmatize text

Natural Language Processing

Natural language text

typed
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transcribed speech



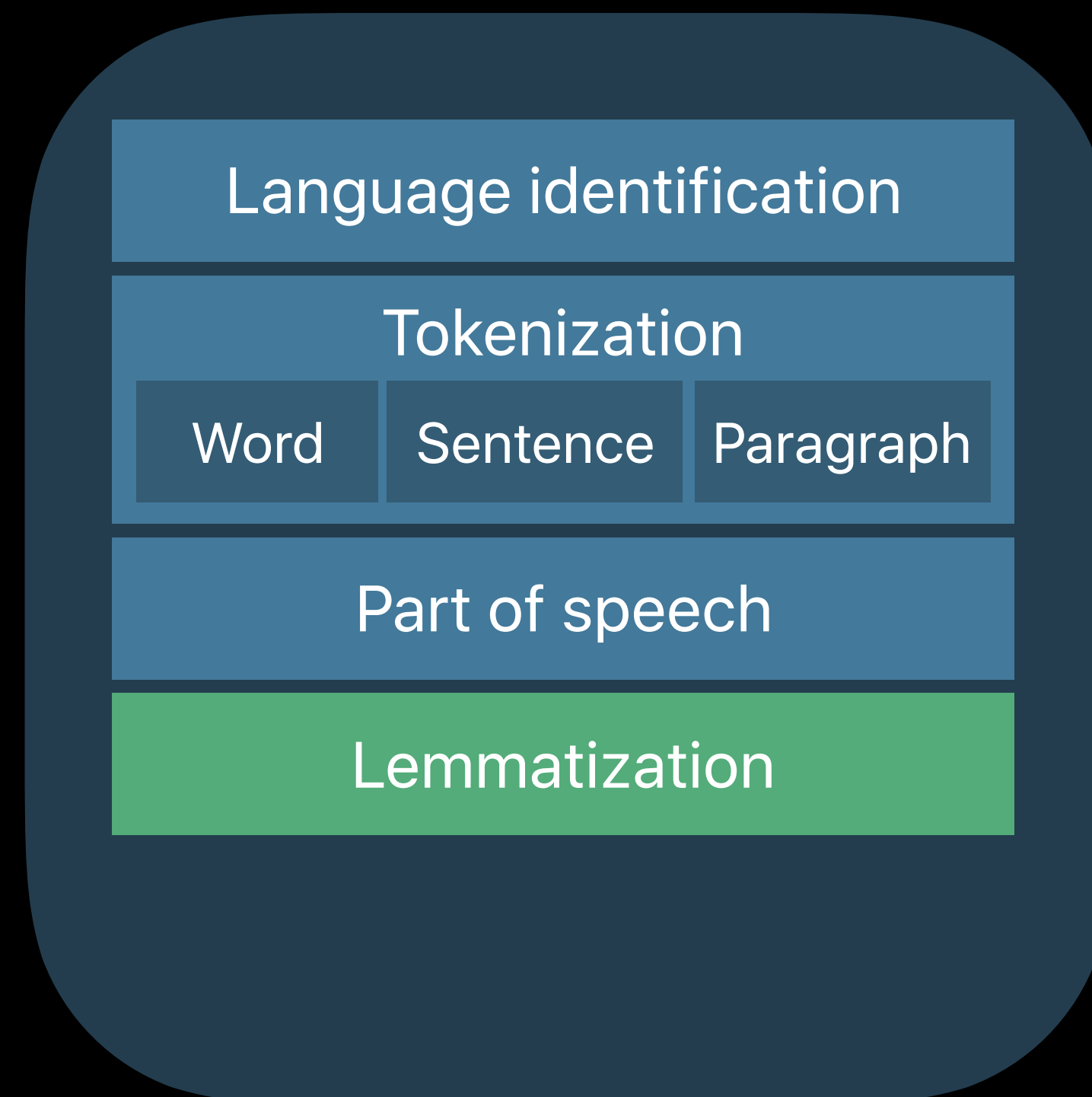
Lemmatize text

Mr. Tim Cook presided over the earnings report of Apple. The stock was up 3% after hours.

Natural Language Processing

Natural language text

typed
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transcribed speech



Lemmatize text

Verb

Mr. Tim Cook presided over the earnings report of Apple. The stock was up 3% after hours.

preside

Verb

be

Noun

hour

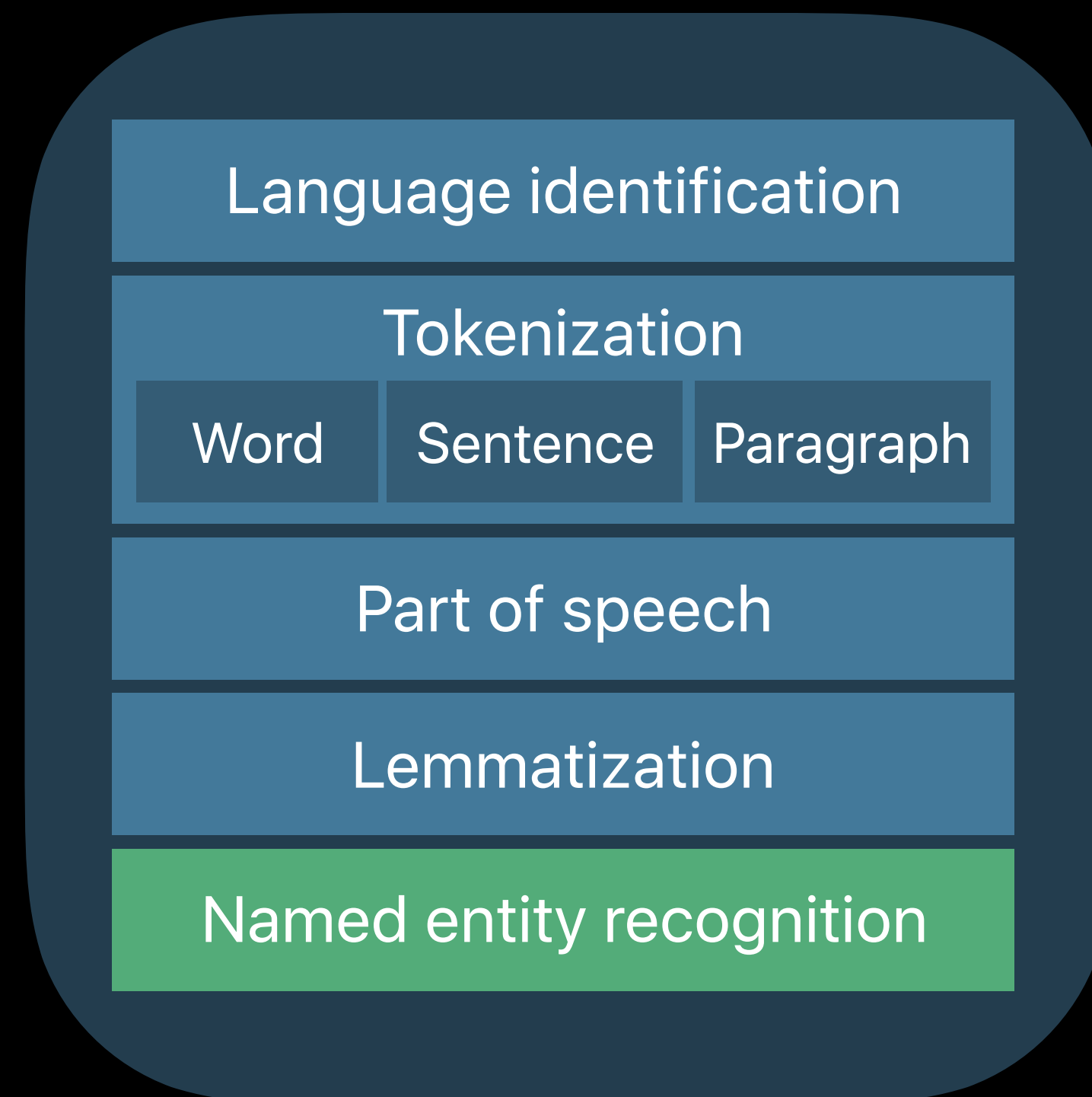
Natural Language Processing

Natural language text

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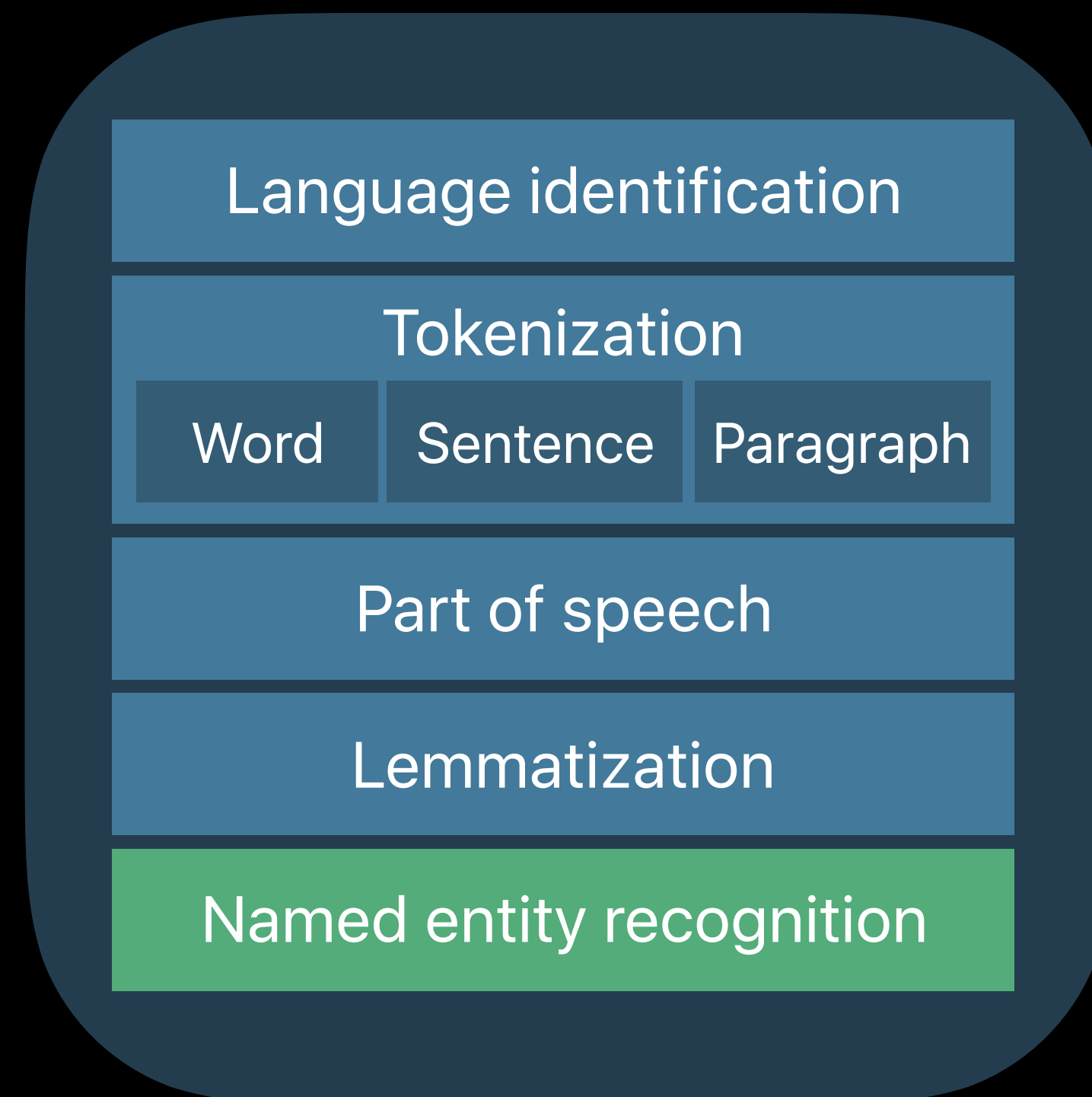
Extract entities

Mr. Tim Cook presided over the earnings report of Apple Inc. on Tuesday.

Natural Language Processing

Natural language text

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transcribed speech



Extract entities

PER

ORG

Mr. Tim Cook presided over the earnings report of **Apple Inc.** on Tuesday.

Natural Language Processing

Natural language text

typed

recognized handwriting

transcribed speech



Confer intelligence

Natural Language Processing

Natural language text

typed
recognized handwriting
transcribed speech



Confer intelligence

Linguistics

Natural Language Processing

Natural language text

typed
recognized handwriting
transcribed speech



Confer intelligence

Linguistics

Machine learning

Natural Language Processing

NLP APIs

Natural language text

typed
recognized handwriting
transcribed speech



Confer intelligence

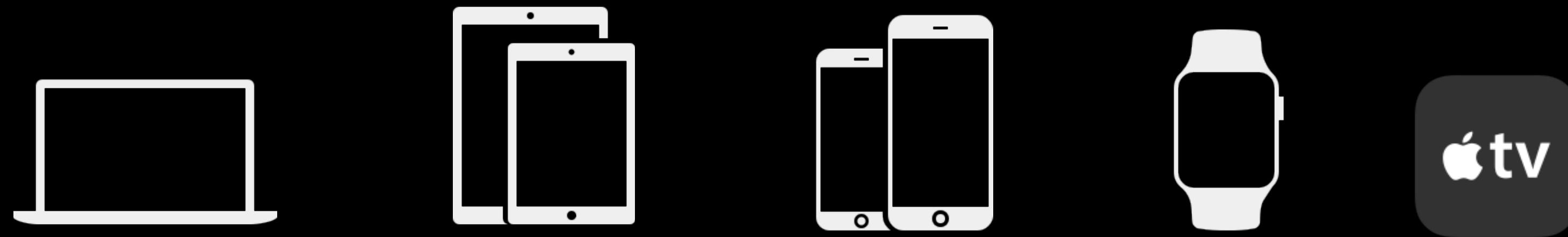
Linguistics

Machine learning

Enough!
Tell me how to use them

NLP APIs

NLP APIs



NSLinguisticTagger

NSLinguisticTagger

Class in foundation

Segment and tag text

Linguistic tasks : tagSchemes

NSLinguisticTagger

Class in foundation

Segment and tag text

Linguistic tasks : tagSchemes



NSLinguisticTagger

NEW

NSLinguisticTagger

NEW

Tagging units

NSLinguisticTagger



NEW

Tagging units

```
public enum NSLinguisticTaggerUnit : Int {  
    case word  
    case sentence  
    case paragraph  
    case document  
}
```

NSLinguisticTagger



NEW

Tagging units

```
public enum NSLinguisticTaggerUnit : Int {  
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NSLinguisticTagger



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public enum NSLinguisticTaggerUnit : Int {  
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    case document  
}
```

Units and schemes

NSLinguisticTagger



NEW

Tagging units

```
public enum NSLinguisticTaggerUnit : Int {  
    case word  
    case sentence  
    case paragraph  
    case document  
}
```

Units and schemes

```
class func availableTagSchemes (for unit: NSLinguisticTaggerUnit, language: String) ->  
    [NSLinguisticTagScheme]
```


NSLinguisticTagger



NEW

Tagging units

```
public enum NSLinguisticTaggerUnit : Int {  
    case word  
    case sentence  
    case paragraph  
    case document  
}
```

Units and schemes

```
class func availableTagSchemes (for unit: NSLinguisticTaggerUnit, language: String) ->  
    [NSLinguisticTagScheme]
```

NSLinguisticTagger

NEW

NSLinguisticTagger

NEW

dominantLanguage

NSLinguisticTagger



NEW

dominantLanguage

Swift 4 : named types for tags and tagSchemes

NSLinguisticTagger



NEW

dominantLanguage

Swift 4 : named types for tags and tagSchemes

Improved performance

Higher accuracy

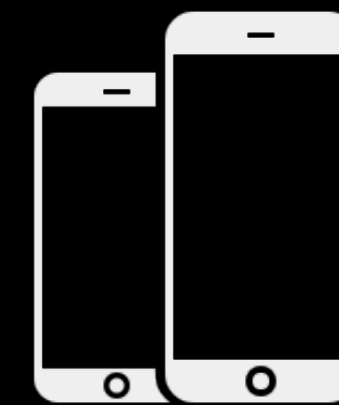
Additional language support

Winnow and Whisk

Winnow and Whisk



Winnow and Whisk



Winnow

Tag photos with descriptions

Winnow

Tag photos with descriptions



Winnow

Tag photos with descriptions

We hiked to the top and then ran down. Lizzie won!



Kids partied with all the goodies...



Die Kleinen haben friedlich zusammen gespielt.



July 4th, 2016...
summer parties at the
Holden's begin!



Winnow

Search for pictures

Winnow

Search for pictures

Hike



Winnow

Search for pictures

Hike



No results

Winnow

Improve search experience using NLP

Winnow

Improve search experience using NLP

Hike



Winnow

Improve search experience using NLP

Hike



We **hiked** to the top and then ran down. Lizzie won!



Great **hikes** make great pics!



Holden family loves **hiking** and also posing for pictures



The **hiking** boys!

Winnow



Winnow



Winnow



NLP



Winnow



NLP

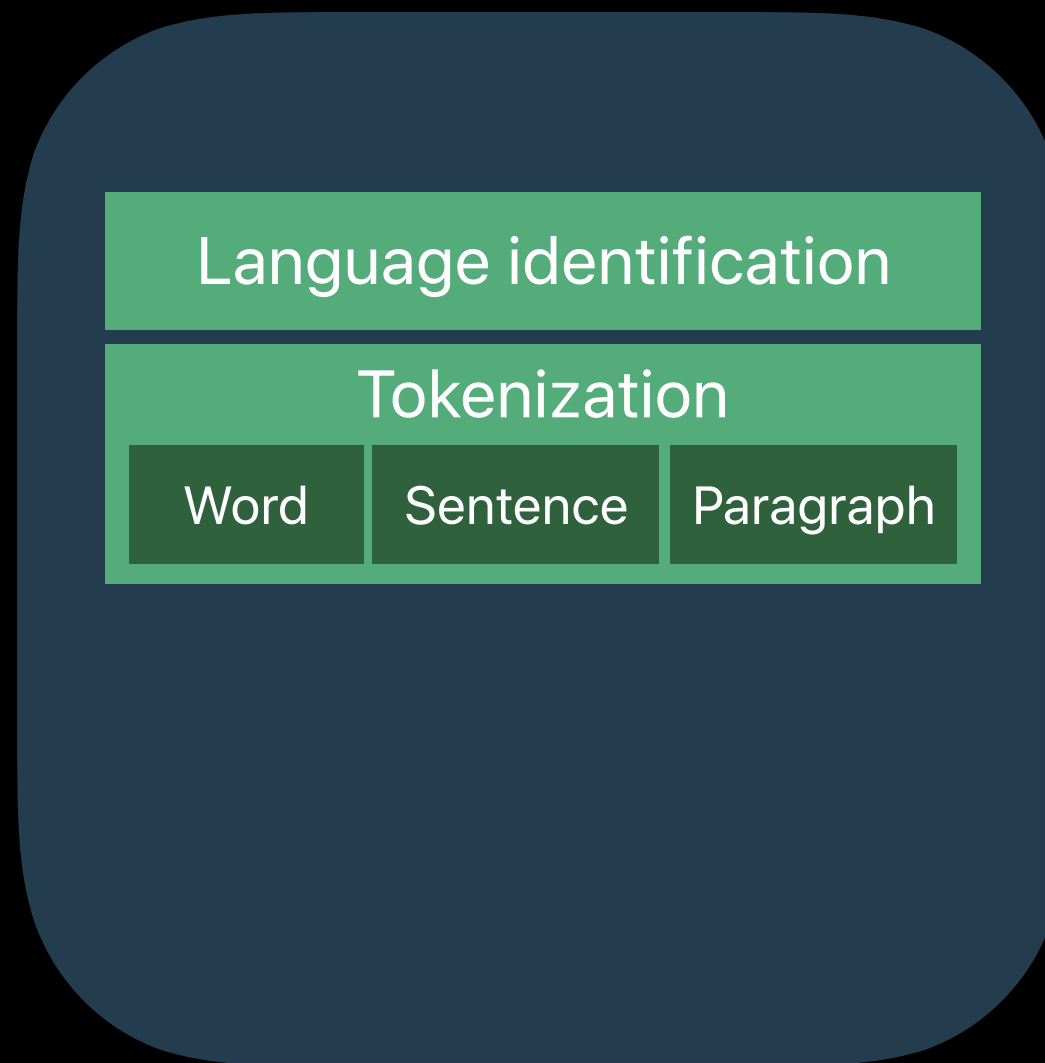
Language identification



Winnow



NLP



Winnow



NLP

Language identification

Tokenization

Word

Sentence

Paragraph

Part of speech

Winnow



NLP



Language identification

Tokenization

Word

Sentence

Paragraph

Part of speech

Lemmatization

Winnow



NLP

Language identification

Tokenization

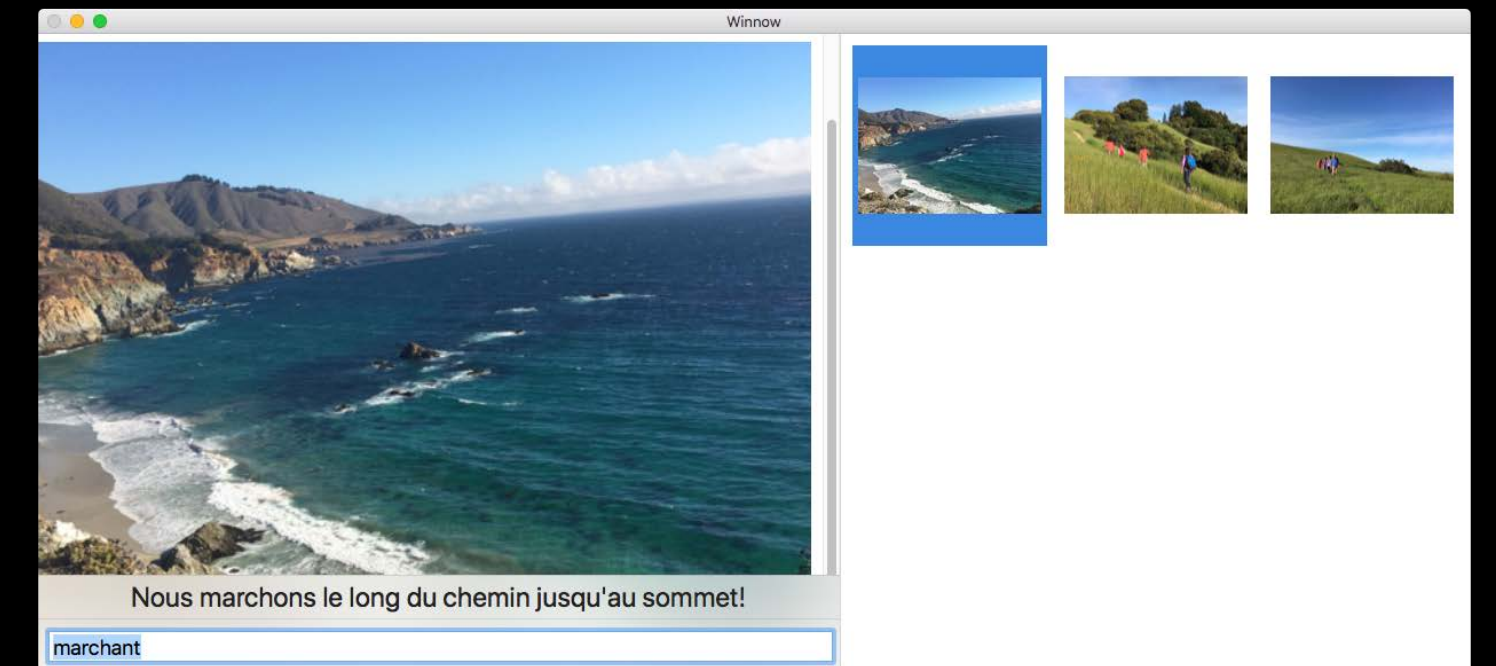
Word

Sentence

Paragraph

Part of speech

Lemmatization



Language Identification

```
import Foundation

let tagger = NSLinguisticTagger(tagSchemes: [.language], options: 0)

tagger.string = "Die Kleinen haben friedlich zusammen gespielt."

let language = tagger.dominantLanguage
```

Language Identification

```
import Foundation
```

```
let tagger = NSLinguisticTagger(tagSchemes: [.language], options: 0)
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Tokenization

```
import Foundation

let tagger = NSLinguisticTagger(tagSchemes: [.tokenType], options: 0)

let text = "NSLinguisticTagger provides text processing APIs.\n NSLinguisticTagger 是苹果的文字处理平台。"

tagger.string = text
let range = NSRange(location: 0, length: text.utf16.count)
let options: NSLinguisticTagger.Options = [.omitPunctuation, .omitWhitespace]

tagger.enumerateTags(in: range, unit: .word, scheme: .tokenType, options: options) {
    tag, tokenRange, stop in
    let token = (text as NSString).substring(with: tokenRange)
    // Do something with each token
}
```

Tokenization

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Lemmatization

```
import Foundation

let tagger = NSLinguisticTagger(tagSchemes:[.lemma], options: 0)

let text = "Great hikes make great pics! Wonderful afternoon in Marin County."

tagger.string = text
let range = NSRange(location:0, length: text.utf16.count)
let options: NSLinguisticTagger.Options = [.omitPunctuation, .omitWhitespace]

tagger.enumerateTags(in: range, unit: .word, scheme: .lemma, options: options) {
    tag, tokenRange, stop in
    if let lemma = tag?.rawValue {
        // Do something with each lemma
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Lemmatization

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```

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```

Demo

Whisk

Collate social media feeds

Whisk

Collate social media feeds



Whisk

Collate social media feeds



Whisk

Organize feeds by People, Organization, and Location using NLP

Whisk

Organize feeds by People, Organization, and Location using NLP

This screenshot shows the Twitter profile of Tim Cook. The profile header includes his name, handle @tim_cook, and a bio: "CEO Apple, Fan of Auburn football and Duke basketball". It also lists his location as Cupertino and that he joined in July 2013. The profile statistics are: 366 tweets, 56 following, 4.92M followers, and 723 likes. The main content area shows a tweet from Tim Cook from 4 hours ago, which reads: "Our stores are dedicated to educating, inspiring and enriching lives. [apple.com/today](#)". Below this is a tweet from Angela Ahrendts: "An amazing launch of #TodayatApple around the world. Huge thank you to everyone at Apple that made it happen." There are also two other tweets from Tim Cook, one from May 20: "We are indebted to all the courageous women & men who serve our country. Thank you! #ArmedForcesDay" and one from May 19: "Thank you to the incomparable Stevie Wonder for lifting hearts and celebrating accessibility with us! #GAAD".

This screenshot shows an Instagram post from the account 'aplemusic'. The post features a video of three people sitting around a table in a recording studio, wearing headphones and speaking into microphones. The video has 22,630 views and was posted 4 weeks ago. The caption reads: "aplemusic On @beats1official's #OTHERtone, @maggierogers sits down with @pharrell and @brokemogul exactly a year after she met Pharrell at NYU." The post has received several comments, including "sugebands Dope 🙌🏻🙌🏻🙌🏻". There is a "Log in to like or comment." prompt at the bottom of the post.

This screenshot shows a Facebook post from the account 'iTunes'. The post includes a video of a glowing blue Batman logo in a dark room. The text of the post says: "Does Batman live in Bruce Wayne's basement? No, Bruce Wayne lives in Batman's attic! Own The LEGO Batman Movie now. [apple.co/LBM](#)". The post has 8.9K views, 46 reactions, and 2 shares. Below the post is a comment box with the text "Write a comment..." and a "Press Enter to post." prompt. At the bottom of the screenshot, there is another post from iTunes dated May 19 at 1:30pm, with the text "From Danish filmmaker Thomas Vinterberg comes bittersweet comedy".

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Home Moments Search Twitter

Tim Cook @tim_cook
CEO Apple, Fan of Auburn football and Duke basketball
Cupertino
Joined July 2013
147 Photos and videos

TWEETS 366 FOLLOWING 56 FOLLOWERS 4.92M LIKES 723

Tweets Tweets & replies Media

Tim Cook @tim_cook · 4h
Our stores are dedicated to educating, inspiring and enriching lives. apple.com/today

Angela Ahrendts @AngelaAhrendts
An amazing launch of #TodayatApple around the world. Huge thank you to everyone at Apple that made it happen.

Tim Cook @tim_cook · May 20
We are indebted to all the courageous women & men who serve our country. Thank you! #ArmedForcesDay

Tim Cook @tim_cook · May 19
Thank you to the incomparable Stevie Wonder for lifting hearts and celebrating accessibility with us! #GAAD

Tim Cook, Apple, Stevie Wonder, Cupertino, Angela Ahrendts

applemusic Follow

22,630 views 4w

applemusic On @beats1official's #OTHERtone, @maggierogers sits down with @pharrell and @brokemogul exactly a year after she met Pharrell at NYU.

load more comments
sugebands Dope 🙌🏻🙏🏻❤️

Log in to like or comment.

Sign up to see photos and videos from your friends. Sign up

Pharrell, NYU

iTunes Vivek H

Like Follow Share ...

"Does Batman live in Bruce Wayne's basement? No, Bruce Wayne lives in Batman's attic!" Own The LEGO Batman Movie now. apple.co/LBM

8.9K Views

Like Comment Share

46

2 shares

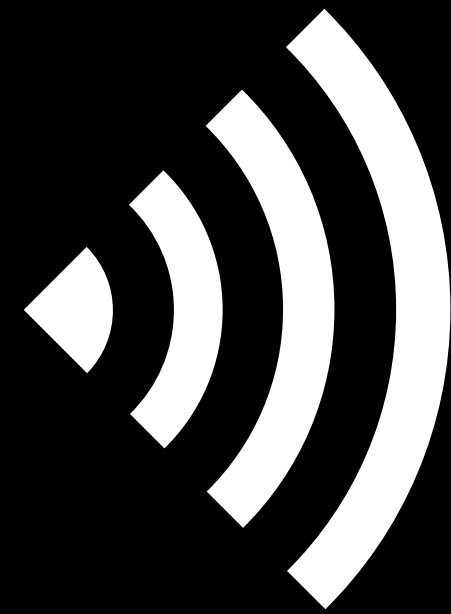
Write a comment...
Press Enter to post.

iTunes
May 19 at 1:30pm · *
From Danish filmmaker Thomas Vinterberg comes bittersweet comedy

Bruce Wayne, Thomas Vintberg

Whisk

Whisk



Whisk



Whisk



NLP



Whisk



NLP

Language identification

Whisk



NLP

Language identification

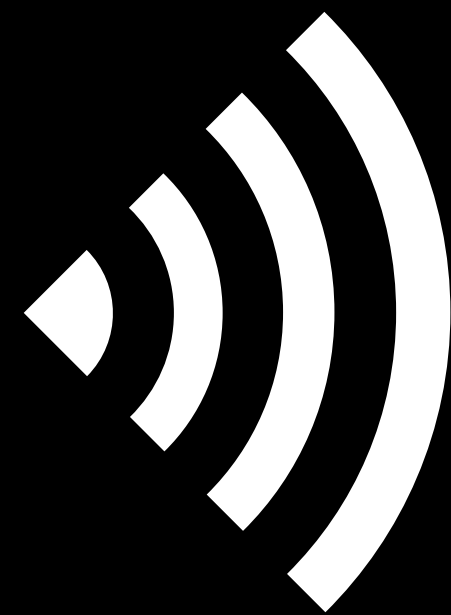
Tokenization

Word

Sentence

Paragraph

Whisk



NLP

Language identification

Tokenization

Word

Sentence

Paragraph

Named entity recognition

Whisk



NLP

Language identification

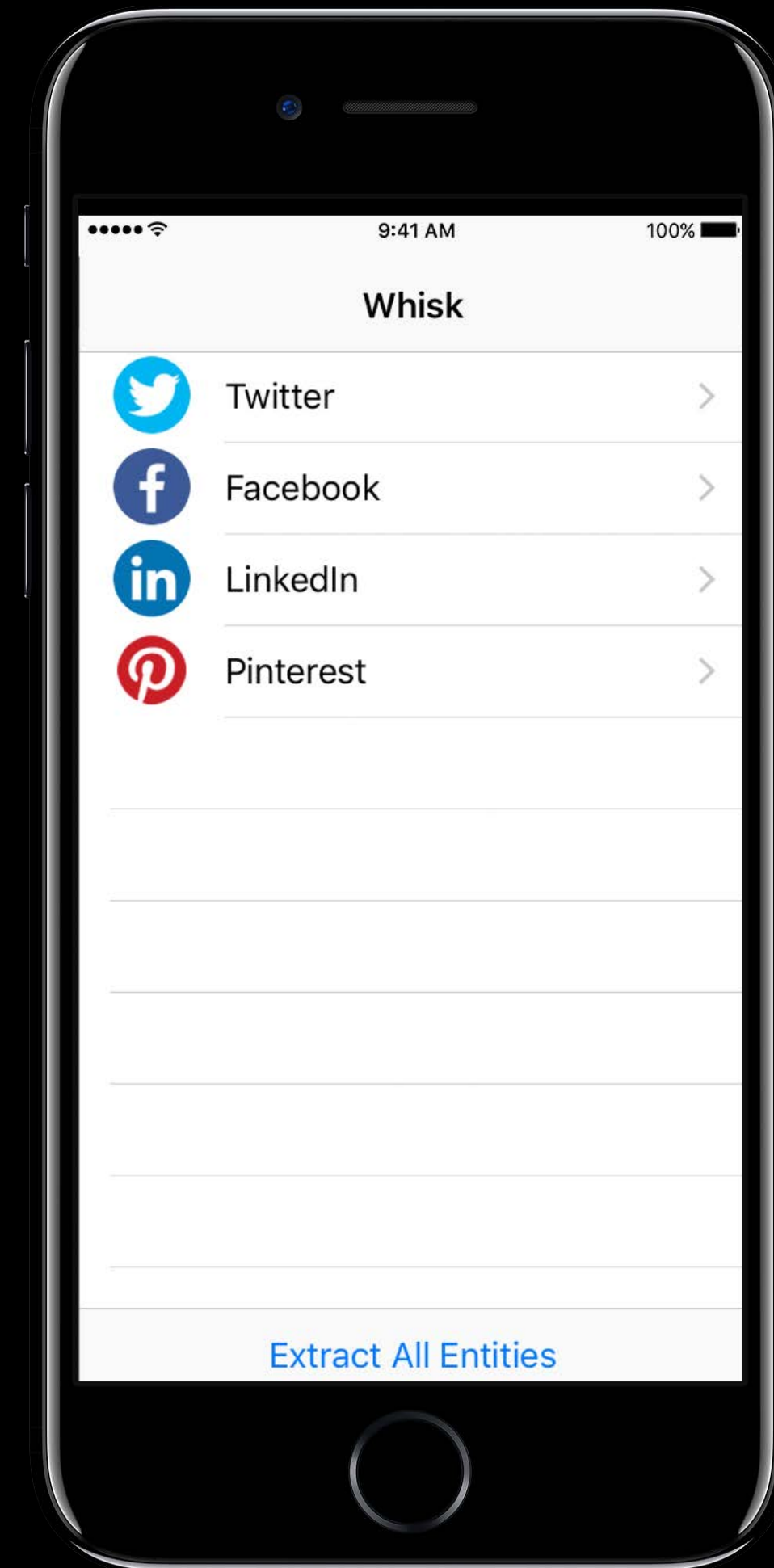
Tokenization

Word

Sentence

Paragraph

Named entity recognition



Named Entity Recognition

```
import Foundation

let tagger = NSLinguisticTagger(tagSchemes: [.nameType], options: 0)

let text = "Tim Cook is the CEO of Apple Inc. which is located in Cupertino, California"

tagger.string = text

let range = NSRange(location:0, length: text.utf16.count)
let options: NSLinguisticTagger.Options = [.omitPunctuation, .omitWhitespace, .joinNames]
let tags: [NSLinguisticTag] = [.personalName, .placeName, .organizationName]

tagger.enumerateTags(in: range, unit: .word, scheme: .nameType, options: options) {
tag, tokenRange, stop in
    if let tag = tag, tags.contains(tag) {
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Named Entity Recognition

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Demo

Why should you use the NLP APIs?

Homogeneous Text Processing

Homogeneous Text Processing

Natural language text

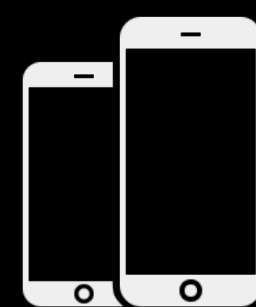
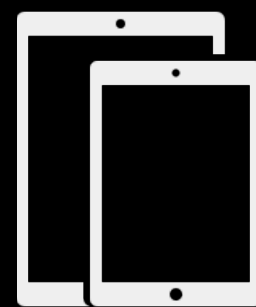
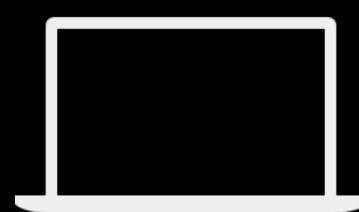
typed

recognized handwriting

transcribed speech



NLP APIs



Consistent text processing

Consistent user experience

Privacy

Privacy

On-device machine learning

User data stays on-device

Performance

Performance

Highly optimized on-device

Multi-threaded

Existing clients—significant speedup

Performance

Highly optimized on-device

Multi-threaded

Existing clients—significant speedup

Chinese tokenization is 30% faster on iOS

Performance

Highly optimized on-device

Multi-threaded

Existing clients—significant speedup

Named Entity Recognition 80% faster on iOS

Performance

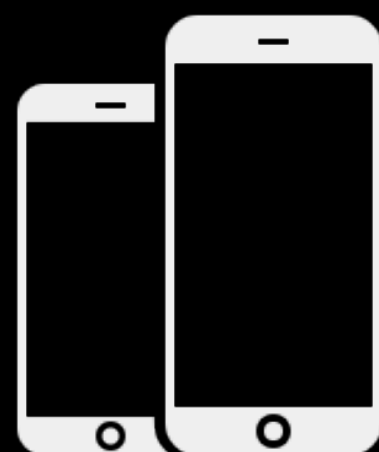
Performance

Part of Speech Tagging

—● **50000**
tokens/sec

—●—● **80000**
tokens/sec

—● 1 thread

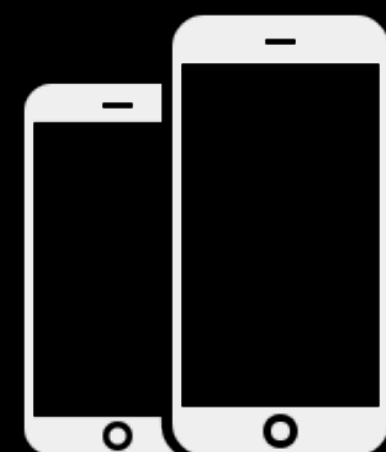


Performance

Part of Speech Tagging

—● **50000**
tokens/sec

—●● **80000**
tokens/sec



Named Entity Recognition

—● **40000**
tokens/sec

—●● **65000**
tokens/sec



—● 1 thread

Language Support

Language Support

Language identification

29 scripts, 52 languages

Language Support

Language identification

29 scripts, 52 languages

Tokenization

All iOS/macOS system languages

Language Support

Language identification

29 scripts, 52 languages

Tokenization

All iOS/macOS system languages

Lemmatization

English

French

Italian

German

Spanish

Portuguese

Russian

Turkish

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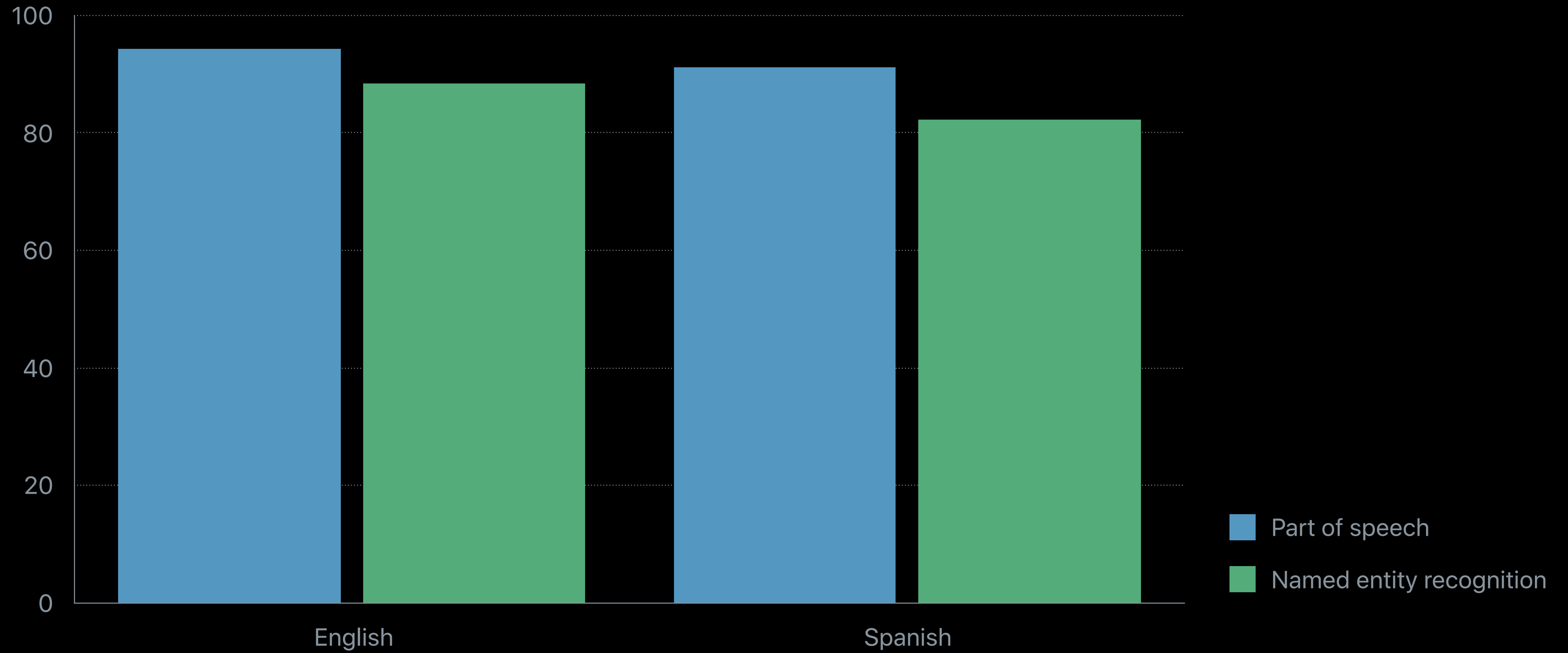
Named entity recognition

Russian

Turkish

Accuracy

Accuracy



Debugging Hints

Debugging Hints

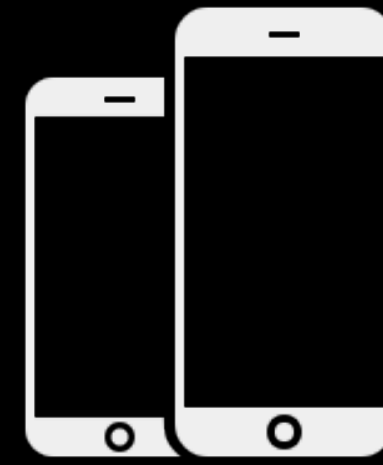
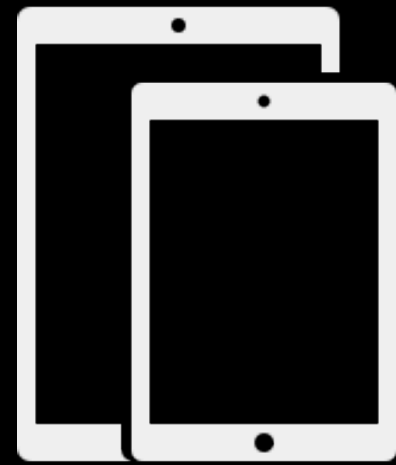
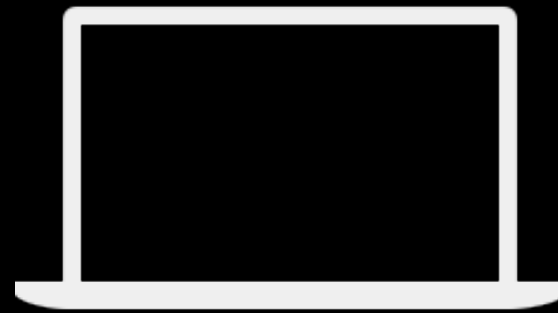
Tags are `NSLinguisticTagOtherWord`

- Model not downloaded

Debugging Hints

Tags are `NSLinguisticTagOtherWord`

- Model not downloaded

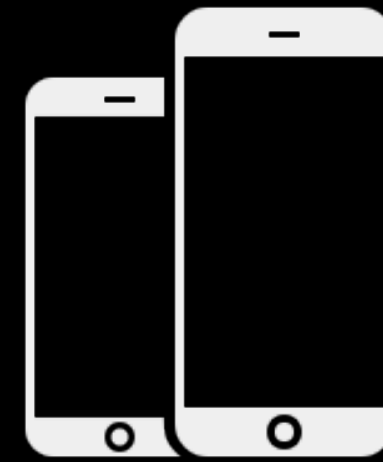
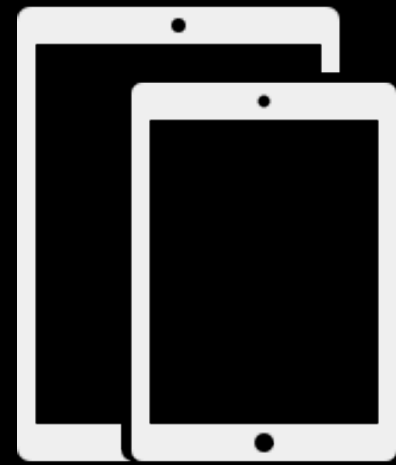
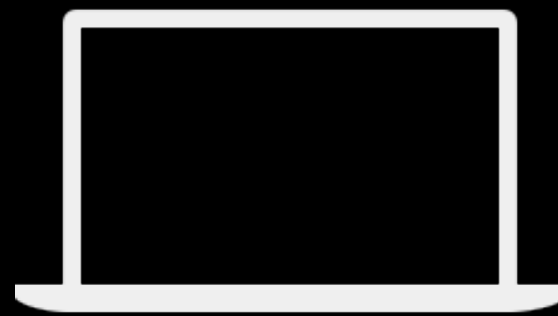


Downloaded over-the-air

Debugging Hints

Tags are `NSLinguisticTagOtherWord`

- Model not downloaded



Downloaded over-the-air

Explicitly set language if known

Summary

NLP APIs—NSLinguisticTagger

- Support for new units
- Faster
- Higher accuracy
- More languages

More Information

<https://developer.apple.com/wwdc17/208>

Related Sessions

What's New in Cocoa Touch

WWDC 2017

Introducing Core ML

WWDC 2017

Vision Framework: Building on Core ML

Hall 2

Wednesday 3:10PM

Core ML in Depth

Hall 3

Thursday 9:00 AM

Accelerate and Sparse Solvers

Grand Ballroom A

Thursday 10:00 AM

Labs

Core ML & Natural Language Processing Lab

Technology Lab D

Thu 11:00AM-3:30PM

Vision Lab

Technology Lab A

Fri 1:50PM-4:00PM

Core ML & Natural Language Processing Lab

Technology Lab D

Fri 1:50PM-4:00PM

Cocoa Lab

Technology Lab B

Fri 1:50PM-3:20PM

