# **Deep Confusables**

Improving Unicode Encoding Attacks with Deep Learning

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#### Who We Are

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#### **Outline**

- 1 Unicode 101
  - Basics

Unicode and confusables

- Punycode
- 2 Related work

Related researches

**Open Source Tools** 

- 3 Deep Learning and Security
  - Some examples
- 4 Deep Confusables
- Unicode attacks in real world
- 6 Countermeasures
- Conclusions

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#### Unicode

- An international encoding standard for use with different languages and scripts, by which each letter, digit, or symbol is assigned a unique numeric value that applies across different platforms and programs.
- Unicode<sup>1</sup> 12.0 adds 554 characters, for a total of 137,928 characters.



<sup>1</sup>https://www.unicode.org

#### Unicode and confusables



PlayStation 4 reportedly crashing due to malicious message

Here's how to protect your PS4 against the bug By Chris Welch | @chriswelch | Oct 15, 2018, 805pm EDT

## What is a confusable?

http://example.org

http://example.org



# What is a confusable?

http://example.org

http://www.xn-xample-2of.org/



# Confusables provided by Unicode Consortium

With this demo<sup>1</sup>, you can supply an Input string and see the combinations that are confusable with it, using data collected by the Unicode consortium. You can also try different restrictions, using characters valid in different approaches to international domain names.

Unicode Utilities: Confusables																						
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<sup>1</sup>https://unicode.org/cldr/utility/confusables.jsp

# **Punycode**

# Unicode Security Mechanisms<sup>1</sup>

Punycode (RFC3492) is a representation of Unicode with the limited ASCII character subset used for IDNA (internationalized domain names). Unicode characters are transcoded to a subset of ASCII (consisting of letters, digits, and hyphen, which is called the Letter-Digit-Hyphen, LDH subset) favored by DNS

http://www.unicode.org/reports/tr39/tr39-19.html

# Confusables provided by Unicode Consortium - FAQs

**Q**: How serious is the problem of spoofing with Unicode characters?

**A**: It is important to recognize that the use of visually confusable characters in spoofing is often overstated. Confusable characters account for a small proportion of phishing problems: most instances of phishing involve social engineering or simple misleading domain names such as "secure-wellsfargo.com". For more information, see http://www.bortzmeyer.org/idn-et-phishing.html. (It is in French, but you can use Google translate or other services to get the gist of the document if you don't read French.)



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#### Related work

```
lrongeek (2017)
http://www.irongeek.com/i.php?page=security/out-of-character-
use-of-punycode-and-homoglyph-attacks-to-obfuscate-urls-for-
phishing
```

DEF CON 26 (2018) - The Tarquin - Weaponizing Unicode Homographs Beyond IDNs https://www.defcon.org/html/defcon-26/dc-26-speakers.html# Tarquin

#### Tools - EvilURL

EvilURL<sup>1</sup>. Generate unicode evil domains for IDN Homograph Attack and detect them.

```
makefvil('a', names[0], unicodes[0], url.replace('a', '\s0610'), end)
    urlMore = urlMore.replace('a', '\u0430')
    urlchars .. 'a.
    urlams .- names[e] . '. '
    urlan to unicodes[8] + 1.
Af "C" in url.upper():
    makefvil('c', names[1], unicodes[1], url.replace('c', '\s03f2'), end)
    urlmore = urlmore.replace('c', '\uengra')
    urlebare to te.
    urlams . names[1] . ', '
    urlin to unicodes[1] t '. '
if "E" in erl.upper():
    maketvil('e', names[2], unicodes[2], url.replace('e', '\smass'), end)
    urlmore = urlmore.replace('e', '\umam')
    urltharn .. 'e.
    urlams . ramen[2] . ..
    uritin to unicodes[2] + 1. 1
if "o" in url.upper():
   makervil('o', names[s], unicodes[s], url.replace('o', '\sease'), end)
    urlMore = urlMore.replace('o', '\u043E')
    urlifbare to 'm.
    urlams . rumen[3] . .
    urism -- unicodes[3] + 1.
if "e" in url.upper():
    makefutlifet names[4] unicodes[4] url replacefiet "lumate") and
```

<sup>1</sup>https://github.com/UndeadSec/EvilURL

## Tools – Squatm3

Squatm3<sup>1</sup> is a Python tool designed to enumerate available domains generated modifying the original domain name through different techniques:

- Substitution attack.
- Flipping attack.
- Homoglyph attack fast (execute a fast homoglyph attack, mutating only one letter at the time).
- Homoglyph attack complete (generates all the possible combinations).



<sup>1</sup>https://github.com/david3107/squatm3

# **Squatm3 – Confusables provided**

# Squatm3<sup>1</sup>

```
| Manual | M
```



 $<sup>^{1} \</sup>verb|https://github.com/david3107/squatm3/blob/master/db/homoglyph|$ 

#### **Tools – Samesame**

Samesame<sup>1</sup> is a lightweight utility for replacing ASCII characters with homograph (look-alike) characters.



<sup>&</sup>lt;sup>1</sup>https://github.com/TheTarquin/samesame

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# **Deep Learning and Security**

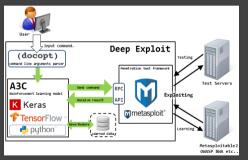
## Why Deep Learning is used in this research?

- Machine Learning and Deep Learning can be used to create offensive and defensive tools.
- It improves human performance on some tasks.
- An increasing amount of hacking tools are appearing in the last years.



# DeepExploit

DeepExploit<sup>1</sup>. Fully automatic penetration test tool using Machine Learning.



<sup>&</sup>lt;sup>1</sup>https://git.io/fj3Yv

#### **PassGAN**

PassGAN<sup>1</sup>. This repository contains code for the PassGAN: A Deep Learning Approach for Password Guessing paper.

TABLE IV: Sample of passwords generated by the GAN that did not match the testing set.

love42743	ilovey2b93	paolo9630	italyit
sadgross	usa2598	s13trumpy	trumpart3
ttybaby5	dark1106	vamperiosa	"dracula
saddracula	luvengland	albania.	bananabake
paleyoung	@crepess	emily1015	enemy20
goku476	coolarse18	iscoolin	serious003
nyc1234	thepotus12	greatrun	babybad528
santazone	apple8487	lloveyoung	bitchin706
toshibaod	tweet1997b	103tears	1holys01



<sup>1</sup>https://github.com/brannondorsey/PassGAN

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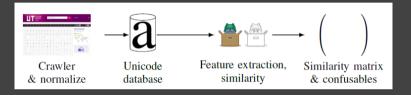
# What is Deep Confusables?

 System to obtain new Unicode confusables using deep learning from Latin characters.

- It works in an automated way.
- Composed of three components:
  - 1 Unicode image database.
  - **2** Feature extractor and similarity comparator.
  - 3 Command Line Interface (CLI).



#### How it works



- Crawler and normalization.
- Feature extraction and similarity comparator.
- Get similarity matrix and confusables.
- Confusables are used by CLI (based on threshold).

# Unicode image database

- Images extracted from https://unicode-table.com.
- Images have been normalized to 34x34 pixels.
- 38,800 images from 266 Unicode blocks.



https://github.com/next-security-lab/unicode-images-database/releases



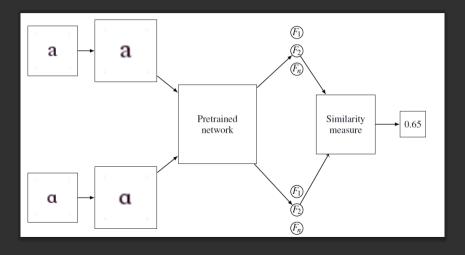
## Feature extraction and similarity comparator

- ① Obtain similarity matrix for each Latin character.
  - For each Latin character and non Latin characters:
    - Extract features using deep learning with a pretrained model (e.g. VGG 16).
    - Compare features using similarity function (e.g. cosine similarity).
- Question of the confusable of the confusable
  - Fix a threshold  $\theta$  between  $0 \le \theta \le 1$ .
  - ullet Obtain Unicode characters whose similarity is greater than heta.



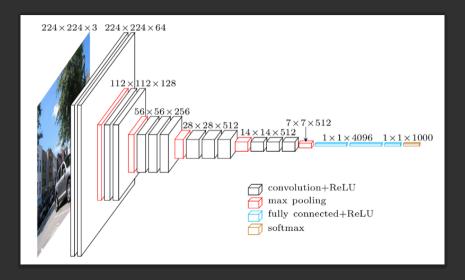
https://github.com/next-security-lab/deep-confusables-similarity/releases

# Feature extraction and similarity comparator - Scheme





# VGG16





# Feature extraction and similarity comparator

# Cosine similarity

$$\cos(x, y) = \frac{\langle x, y \rangle}{\|x\| \cdot \|y\|}$$

(1)



#### **Command Line Interface**

- Creates new domains given a threshold using confusables.
- Only Latin characters supported.
- Some features.
  - Check if domains are up.
  - Check Whois.
  - Check domain against VirusTotal (API key needed).



https://github.com/next-security-lab/deep-confusablescli

## **Command Line Interface – Some use cases**

- Offensive tool
  - Red team.
  - APT.
  - Impersonate domains.
  - Phishing campaigns.
- 2 Defensive tool
  - Blue team.
  - Detect similar domains to ours.
  - Register similar domains.



# **Command Line Interface – Demo**



# **Deep Confusables dictionary**

- We have combined static dictionaries from other tools with our confusables with threshold 75%.
- It can be used in some use cases.



https://github.com/next-security-lab/deep-confusables-cli/blob/master/deep\_confusables\_lite/confusables.txt



## **UriDeep**

- It is like DeepConfusables CLI, but faster.
- Based on Deep Confusables dictionary.
- It can reduce false positive rate.
- It includes additional functionality
  - Substitution attack.
  - Flipping attack.



https://github.com/mindcrypt/uriDeep https://github.com/mindcrypt/uriDeep/blob/master/data/ deepDiccConfusables.txt

# **UriDeep – Demo**



#### Some results

- Top 10,000 domains from Alexa analyzed.
- Domains generated with Deep Confusables dictionary.
- 54 confusables per character on average.
- 27,876 domains are up.



# **Some examples**

amazón.es, góogle.es skypê.net, skýpe.net, skÿpe.net, skypè.net, skypé.net, fàcebook.net, fâcebook.net, facêbook.net, facêbook.net, facêbook.net, twītter.com, t-mobìle.com, aliexpress.com, applē.com, îkea.com, braźzers.com, īnstagram.com, netflìx.com, facebook.com, the uardian.com, ebáy.com, americanexpress.com, adidas.com, sèx.com, whatsàpp.com, àirbnb.com, nytímes.com, baīdu.com, office.com, mìcrosoft.com, wikipédia.com, disneylandpaṛis.com, xvideos.com, amazoŋ.com, goog e.com.ph, microsoft.com, dropbox.com, ýouporn.com, vodafoṇe.com, icloud.com, poŕnhub.com, netflix.com ...



# **Evade Punycode**

Google Chrome's IDN policy: https://www.chromium.org/developers/design-documents/idnin-google-chrome

### Google Chrome's IDN policy

Starting with Google Chrome 51, whether or not to show hostnames in Unicode is determined independently of the January settings (the Accent-Language list). Its about the is similar to what Firefox does if the change is description that implemented the new policy ).

Google Chrome decides if it should show Unicode or purycode for each domain label (component) of a hostname separately. To decide if a component should be shown in Unicode. Google Chrome uses the following algorithm:

- Convert each component stored in the ACE to Unicode per LITS 46 transitional processing (ToUnicode).
- . If there is an error in ToUnicode conversion (e.g. contains disaflowed characters, starts with a combining mark, or violates BID rules), punycode is displayed.
- . If there is a character in a label not belonging to Characters ellowed in identifiers per Unicode Technical Standard 39 (UTS 39), purycode is displayed. . If any character in a label belongs to the black list, purrycode is displayed.
- . If the component uses characters drawn from multiple scripts, it is subject to a script mixing check based on "Highly Restrictive" profile of UTS 39 with an additional restriction on Latin. Failing the check, the component is shown in nunwoode
  - a Latin, Cyrillic or Greek characters cannot be mixed with each other Latin characters in the ASCII range can be mixed ONLY with Chinese (Han. Bonomoto). Japanese (Kanii, Katakana, Hiragana), or Korean (Hangui, Hanja).
  - Han (CJK Ideographs) can be mixed with Repemofo.
  - Han can be mixed with Hiragana and Katakana Han can be mixed with Korean Hangul
- If two or more numbering systems (e.g. European digits + Bengali digits) are mixed, punycode is shown
- If there are any invisible characters (a.g. a sequence of the same combining mark or a sequence of Kana combining marks), numerode is shown
- Test the label for mixed script confusable per UTS 39. If mixed script confusable is detected, show purivcide.
- If a bestname belongs to an non-IDN TLD(ton-level-domain) such as 'com', 'net' or 'uk' and all the letters in a given label belong to a set of Cyrillic letters that look like Latin letters (e.g. Cyrillic Small Letter IF e.), show
- punycode. If the label matches a dangerous pattern, punycode is shown.
- . If the end of a hostname is identical to one of top 10k domains after removing discritic marks and mapping each character to its spoofing skeleton (e.g. www.googlé.com with 'e' in place of 'e'), punycode is shown. · Otherwise. Unicode is shown.
- Potential characters: ą ę ģ ġ į k ļ ņ ŗ ș ţ ų



















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# Unicode attacks in real world

# Security in depth

- Software issues
- Stego
- Plagiarism detectors

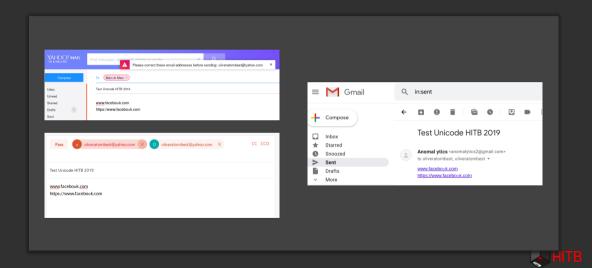


# **Software issues**

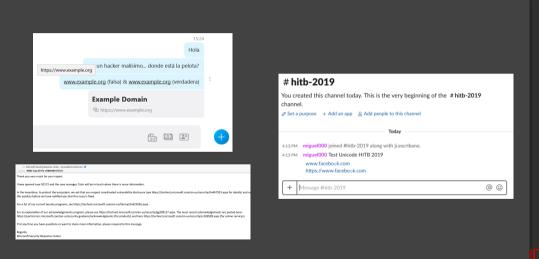
- Web mail clients
- Instant messaging
- Social networks
- Office software
- PDF readers



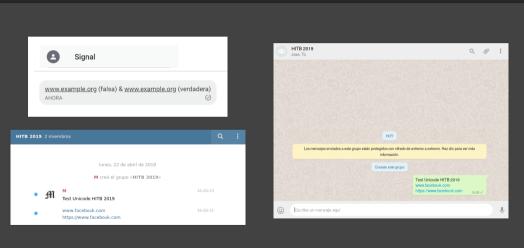
# Web mail clients - Yahoo, Outlook & GMail



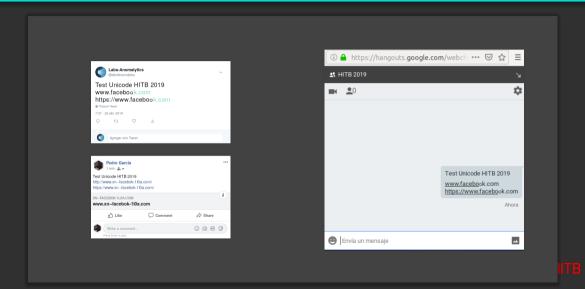
# Instant messaging - Skype & Slack



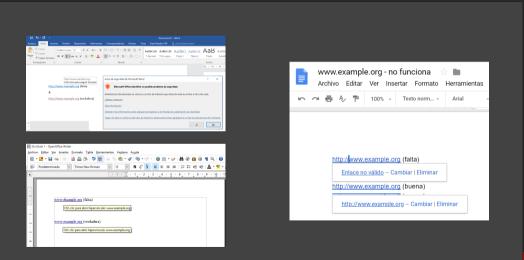
# Instant messaging – Telegram, Signal & WhatsApp



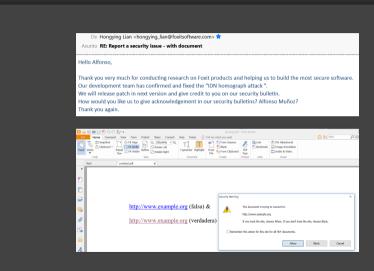
# Social networks - Facebook, Hangouts & Twitter



# Office software - Microsoft Office, OpenOffice & GSuite



# PDF reader - Foxit Reader



# **Summary**

Software	Issues with Unicode encoding	Answer from provider
Skype Desktop <sup>1</sup>	No info provided to detect a fake domain	Recognize issue and working to solve it
Foxit Reader <sup>2</sup>	No info provided to detect a fake domain	Recognize issue and working to solve it
Telegram	No info provided to detect a fake domain	Recognize issue and working to solve it
ProtonMail	Does not expand domain or disable link	No answer
LinkedIn	Does not expand domain or disable link in articles	No answer
Social networks based on free software	Does not expand domain or disable link	No answer
OpenOffice	No info provided to detect a fake domain	No answer
Signal	No info provided to detect a fake domain	No answer
WhatsApp	No info provided to detect a fake domain	Won't fix. UX, social engineering and browser protection issue
GMail	Does not expand domain or disable link	Won't fix. UX, social engineering and browser protection issue

 $<sup>{}^{1}</sup> h ttps://portal.msrc.microsoft.com/en-us/security-guidance/researcher-acknowledgments-online-services$ 

<sup>&</sup>lt;sup>2</sup>https://www.foxitsoftware.com/support/security-bulletins.php

# Stego with confusables

- It is possible to use stego to hide information using confusables.
- Other tools only use spaces to hide information.
- StegUnicode: only support text (at the moment).



https://github.com/mindcrypt/stegUnicode



# StegUnicode - Demo



# **Bypassing Turnitin and Plagscan**

- Tested with some text of Don Quixote (in Spanish).
- Replace Latin a with Cyrillic a.





# Doctoral thesis of President of the Govenrment Sánchez easily passes text matching systems

Friday 14 September 2018



The work was analysed by two of the most rigorous programmes at an academic level: Turnitin, used at Oxford University and PlagScan, the European benchmark.

Pool Moncloa/Fernando Calvo/Archivo

After the analysis of the doctoral thesis which was presented by the President of the Govennment, Pedro Sánchez, in 2012, the evaluation made by the tools Turnitin and PlacScan have determined the original content of the thesis, which easily passes the text matching systems.

In the case of Turnitin, the result was 13%, while PlagScan gave a figure of 0.96%, each one with its own methodology. These percentages are due to the quotes and compulsory references in the drafting of any research document that all software programmes are unable to discern by default, regardless, their bitseth nature.



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# **Browser countermeasures**

- Convert to Punycode every domain.
- Firefox
  - Go to about:config.
  - Set network.IDN\_show\_punycode to true.
- Chrome
  - Install an extension.
    - Punycode Alert
       (https://chrome.google.com/webstore/detail/punycode alert/odbbcdajedbapmgpgfacfigdpbdahenh?hl=en-GB). Available for
       Firefox.













# SORRYI

If you are the owner of this website, please contact your hosting provider; webmaster@xn--icoud-l7a.co

It is possible you have reached this page because:







There has been a server



The site may have moved to a

### **Punycode Alerter**

### What is punycode?

Punycode is a way of representing URLs that allows more characters than ASCII.

### Why is this a problem?

An attacker can use punycode to register a domain that looks like an official one. In a browser's URL field, https://www.xn--80ak6aa92e.com looks just like https://www.apple.com. Users can misled into entering their credentials on this fake website.

### More information:

- Technical details
- Media
- How Chromium (Chrome) handles it

Author: Yábir Garcia, Thanks to @midopa

### Icon by Madebyoliver

This extension can be found at Github under MIT license. If you liked it and want to help, you can

donate Bitcoins: 1Gdc7hdsQqCWfqcihWdM2oxpqvvZ7vCN5D

### icloud.com

hours for DNS changes to propagate. It may be possible to restore access to this site by following these instructions for clearing your dns cache.

and DNS records. A restart of Apache may be required for new settings to take effect.

server



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## **Conclusions**

- Confusables are characters very similar to other ones.
- Unicode Consortium provides a list of confusables.
- Deep Confusables improves generation of confusables using deep leaning in an automated way.
- There are issues in several applications with Unicode characters.
- Confusables can be used in several use cases such as bypassing plagiarism detectors or stego.



# **Deep Confusables**

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