

Unleash The Kraken

The Art of Password Cracking



whoami

Hacker @ Northwestern Mutual

Previously: 403 Labs/Sikich, FIS/Metavante



What is password cracking?

The discovery of a plaintext value that produces a hash equal to the target hash.



What's a hash?

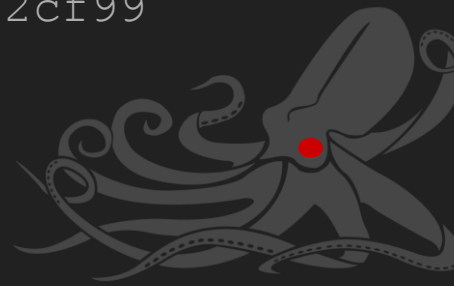
A hash is a one-way cryptographic algorithm.

Common algorithms:

- MD5
- SHA1
- NTLM

Example:

```
md5('password') = 5f4dcc3b5aa765d61d8327deb882cf99
```



Hashing != Encryption



Why Crack Hashes?

Attackers

- Lateral movement
- Privilege escalation
- Reuse (password and hash)

Defenders

- Adherence to password policy
- Baseline awareness training
- Monitor password reuse (internal & external)



Where are hashes stored?

- Local Windows SAM file
 - LM/NTLM
- Active Directory
 - LM/NTLM
- Websites
 - Databases
 - 3rd party identity providers



How to Obtain Hashes

- NTLM

- Active Directory ntdsutil ([https://technet.microsoft.com/en-us/library/cc753343\(v=ws.11\).aspx](https://technet.microsoft.com/en-us/library/cc753343(v=ws.11).aspx))
- Lan Turtle (<https://room362.com/post/2016/snagging-creds-from-locked-machines/>)
- Mimikatz
- PowerShell post-exploitation tools
- pwdump/fgdump

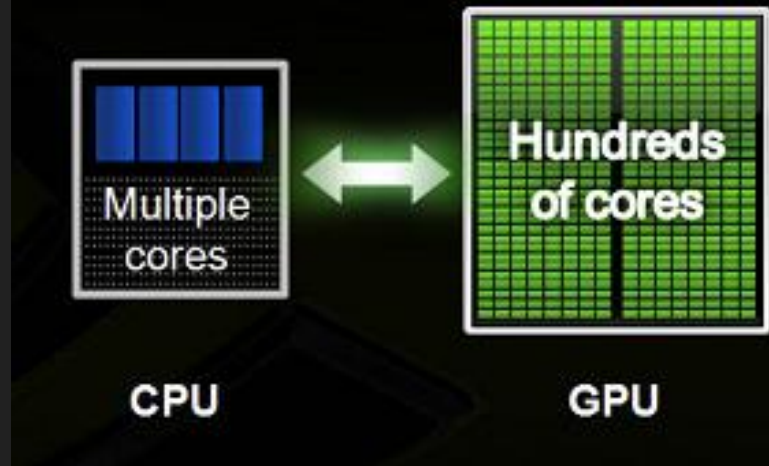
- Websites

- SQL Injection
- Admin interfaces
- Direct DB access



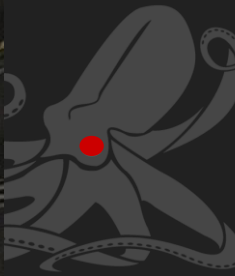
Types of Cracking

- CPU - Standard CPUs
 - 24 threads ~5 Billion guesses/sec
- GPU - Graphics Cards
 - 6 Nvidia GPUs ~75 Billion guesses/sec
- FPGA/ASIC
 - Fast, but \$\$\$\$
- Rainbow Tables
 - ? Too slow



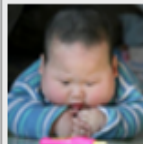
<http://resources.infosecinstitute.com/password-cracking-evolution/>





367k MD5 Hashes

Goto page [1](#), [2](#) [Next](#)

[New Topic](#)[Post Reply](#)[InsidePro Software Forum Index -> Standard Hashes](#)**Author****Mess****vimeo1903**

Joined: 10 Sep 2011

Posts: 356

Gold Member >>Reputation: [223](#)

Posted: Mon May 29, 2017 2:40 pm Post subject: 367k MD5 Hashes

Please help with 367k MD5 Hashes

<https://www.sendspace.com/file/5ymk42>

The Art

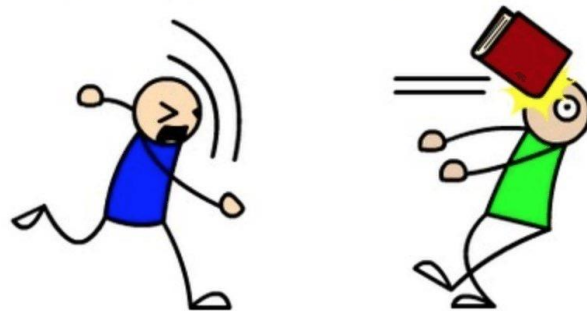


Dictionary (Wordlist) Attacks

A text file with password candidates.

- Common Dictionaries
 - John the Ripper, 500 worst, etc
- Literal dictionaries
 - Various languages
- Leaked
 - Rock You
 - Hashes.org (60 leaks including LinkedIn, eHarmony, Yahoo!, etc.)
 - Troy Hunt's Pwned Passwords (<https://haveibeenpwned.com/Passwords>)
- Compiled
 - Crackstation (<https://crackstation.net/>)
 - Purehate's Wordlist
- Custom
 - Cewl

DICTIONARY ATTACK!



<https://twitter.com/andyf/status/896032178622083077>



Wordlist



Rules

Transform or modify a password candidate

Input: password

Rule	Transform
T0	Password
\$1	password1



rules



wordlist + rules

—

Good Rule Sets

- Default hashcat
 - T0XICv1.rule
 - dive.rule
 - d3ad0ne.rule
- Hob0Rules (<https://github.com/praetorian-inc/Hob0Rules>)
- Make your own!



Brute Force

Exhausts all possible password candidates.

aaaaaaaa

aaaaaaab

aaaaaaac

aaaaaad

aaaaaae

aaaaaaf

aaaaaag

aaaaaah

.....



STARTS A BRUTE-FORCE ATTACK

STILL RUNNING...

Keyspace

Calculated by the length to the potential character power.

8 characters upper, lower, digits & specials =

$$8^{(26 + 26 + 10 + 34)} =$$

49732323640978664215538224814682084010045615079734771744046397689
3159497012533375533056

~23h30m of cracking time



brute force



Masks

A per-position targeted brute force attack

- ?l = abcdefghijklmnopqrstuvwxyz
- ?u = ABCDEFGHIJKLMNOPQRSTUVWXYZ
- ?d = 1234567890
- ?s = «space»!"#\$%&'()*+,-./:;<=>?@[\\]^_`{|}~
- ?a = ?l?u?d?s
- ?1 = custom char set 1
- ?2 = custom char set 2
- ?3 = custom char set 3
- ?4 = custom char set 4



Masks Reduce Keyspace

Humans use predictable password patterns

Packers1 = ?u?l?l?l?l?l?d ($26*26*26*26*26*26*26*10 = 80.3$ Billion)

- Regular brute force of 8 chars ~1 day
- This mask takes ~1 second
- Mask is also valid for Brewers3



Password Analysis and Cracking Kit (PACK)

- <https://thesprawl.org/projects/pack/>
- StatsGen - Statistically analyze a word list
- MaskGen - Generates masks based on common password patterns
- PolicyGen - Generate masks based on a password policy
- RuleGen - Analyze a password to detect rules and source word



masks



Reduce Keyspace

```
#!/usr/bin/env python
import sys
```

```
with open(sys.argv[1], 'rb') as fin:
    for line in fin:
        mask = line.strip()
        for c in mask:
            if c == 's':
                mask = '!@.$#*_ - ,%s' % mask.replace('s', '1')
                break

print(mask)
```

Example:

```
?1?s?d?d?d?d = 8580000 (8.6M)
!@.$#*_ - ,?1?1?d?d?d?d = 2340000 (2.3M) 73%
```



Markov Chains

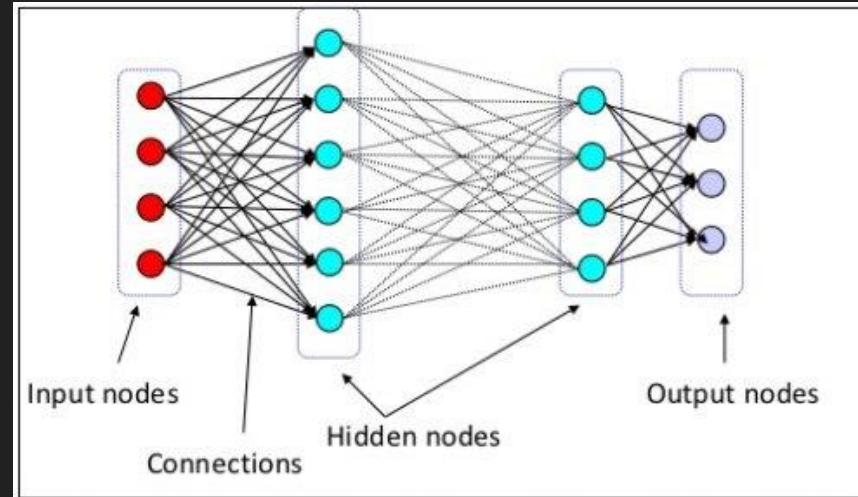
A probability mass function to determine the next state

```
> table(chain[['walk ']]) / length(chain[['walk ']])  
 a   b   i   l   m   o   u  
0.4 0.1 0.1 0.1 0.1 0.1 0.1
```



What is Machine Learning?

- Mislabeled as “Artificial Intelligence”
- Really an advanced statistics processor
- Can “predict” future outcomes based on the past



ML Applied to Password Cracking

1. Input already cracked passwords as a training set
2. Train the neural network
3. Generate password candidates to test effectiveness



ML Attempt 1 (Fail)

```
[root@kraken]# python learn_passwords.py cheddarcon
```

```
Using TensorFlow backend.
```

```
..snip..
```

```
[*] Total Characters: 1705765
```

```
[*] Total Vocab: 125
```

```
[*] Total Patterns: 1705665
```

```
[*] training model...
```

```
Epoch 1/50
```

```
43500/1705665 [.....] - ETA: 17711s - loss: 3.5119
```

```
1  [|||||||||90.8%]    7  [|||||||||87.8%]    13 [|||||||||100.0%]   19 [|||||||||83.8 ]
2  [|||||||||93.3%]    8  [|||||||||83.3%]    14 [|||||||||100.0%]   20 [|||||||||91.0 ]
3  [|||||||||100.0%]   9  [|||||||||85.3 ]    15 [|||||||||98.0%]   21 [|||||||||93.4%]
4  [|||||||||98.0%]   10 [|||||||||93.5%]   16 [|||||||||96.7%]   22 [|||||||||91.5%]
5  [|||||||||95.5%]   11 [|||||||||92.1 ]    17 [|||||||||98.7%]   23 [|||||||||96.7%]
6  [|||||||||95.4%]   12 [|||||||||85.9 ]    18 [|||||||||95.3%]   24 [|||||||||87.6 ]
Mem[|||||||||12.40/62.80]  Tasks: 141, 347 thr; 23 running
Swp[| 4.85M/63.90]       Load average: 29.44 22.68 16.75
                          Uptime: 1 day, 22:06:53
```

ML Attempt 2

<https://0day.work/using-neural-networks-for-password-cracking/>

```
for i in $(ls cv/*.t7); do th sample.lua -length 100000 $i >  
output/${i/t7/txt}; done
```

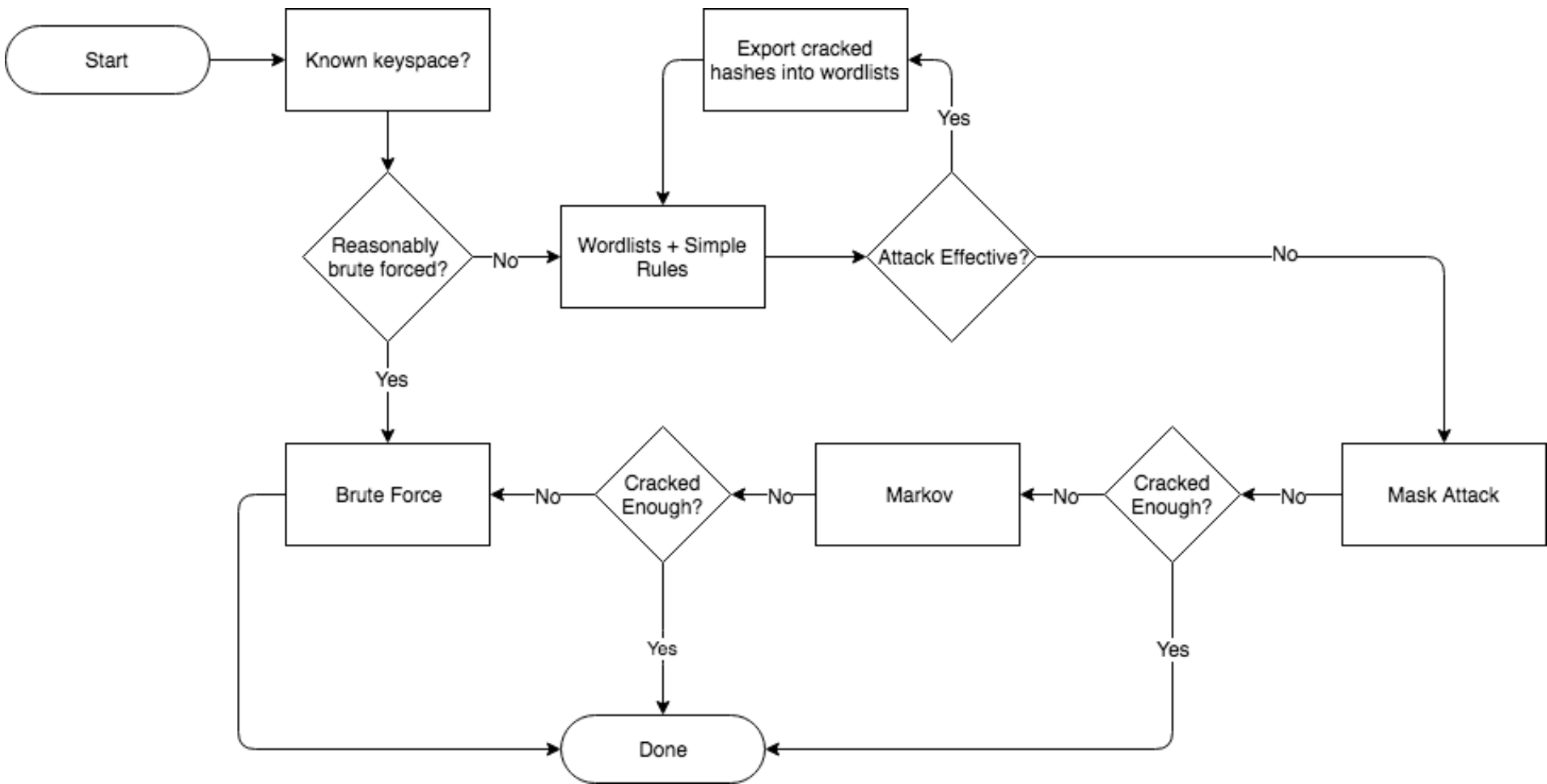
Success! 22 new passwords were discovered using this method.

```
7a264f32ef16ff818199b9fece0355c0:themexp10120611  
a0a328c6c8516ed9bea587e1c11e6cf3:guyu19855141  
d36ed65fcb680bbb47a7b5a3d0350ec9:niirproject72  
ff923e8cd9d0495f610d3198362e8c34:niirproject3
```



Methodology






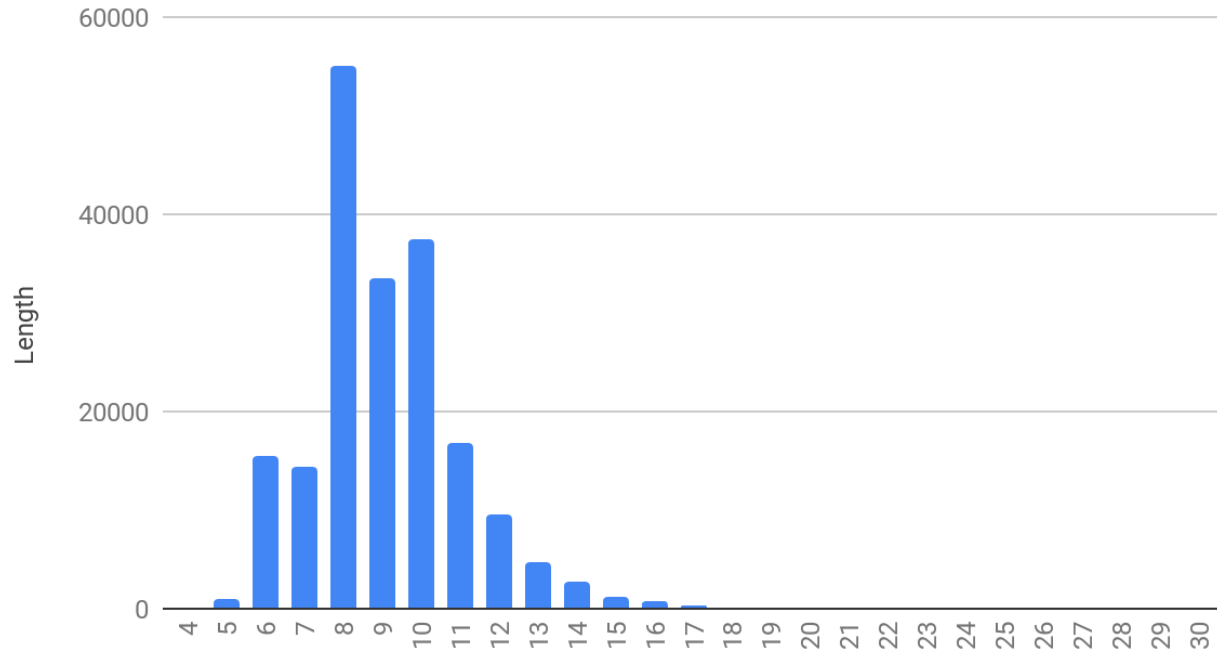
So how did our attacks fare?

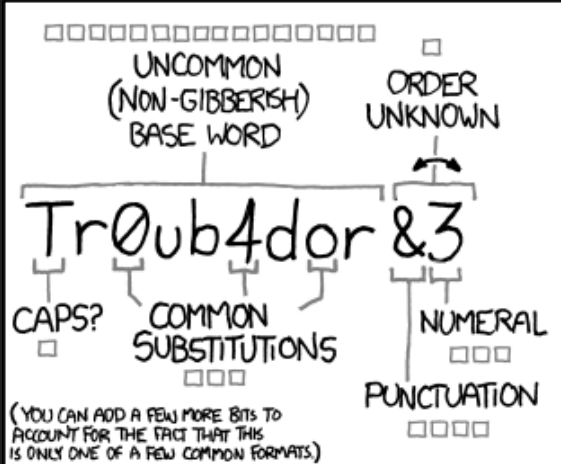
Attack	% Cracked	Cumulative %	Elapsed Time
wordlists	20.44%	20.44%	2m13s
ztg.rule * 2	+35.29%	55.73%	9m44s
D3adhob0.rule	+6.79%	62.52%	26m15s
T0XICv1.rule + ztg.rule	+15.3%	77.83%	20.6h
Brute all 1-7 chars	+0.25%	78.08%	16m59s
PACK mask attack >= 8	+6.85%	84.93%	11 hours (stopped)
Machine Learning	+0.0%	84.93%	<1m
Markov 8chr	+0.05%	84.98%	1 hour
rules/d3ad0ne.rule	+0.48%	85.46%	33m2s
Misc rules + Markov masks	+0.36%	85.82%	2h

Feedback Loops



Password Length





~28 BITS OF ENTROPY

$2^{28} = 3 \text{ DAYS AT } 1000 \text{ GUESSES/SEC}$

(PLAUSIBLE ATTACK ON A WEAK REMOTE WEB SERVICE. YES, CRACKING A STOLEN HASH IS FASTER, BUT IT'S NOT WHAT THE AVERAGE USER SHOULD WORRY ABOUT.)

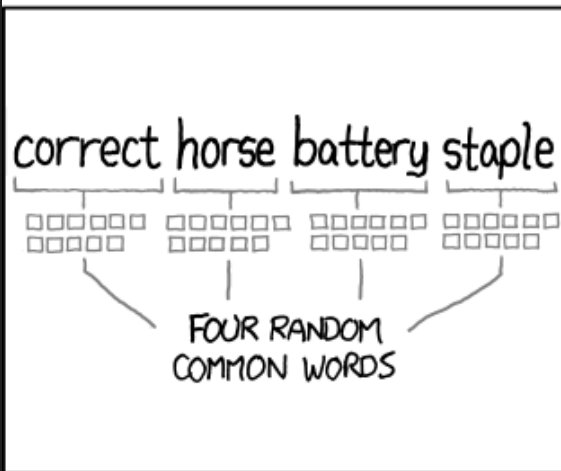
DIFFICULTY TO GUESS: **EASY**

A diagram of small squares representing bits of entropy, with a larger square indicating the total of 28 bits.

WAS IT TROMBONE? NO, TROUBADOR. AND ONE OF THE 0s WAS A ZERO?

AND THERE WAS SOME SYMBOL...

DIFFICULTY TO REMEMBER: **HARD**



~44 BITS OF ENTROPY

$2^{44} = 550 \text{ YEARS AT } 1000 \text{ GUESSES/SEC}$

DIFFICULTY TO GUESS: **HARD**

A diagram of small squares representing bits of entropy, with a larger square indicating the total of 44 bits.

THAT'S A BATTERY STAPLE.

CORRECT!

DIFFICULTY TO REMEMBER: YOU'VE ALREADY MEMORIZED IT

THROUGH 20 YEARS OF EFFORT, WE'VE SUCCESSFULLY TRAINED EVERYONE TO USE PASSWORDS THAT ARE HARD FOR HUMANS TO REMEMBER, BUT EASY FOR COMPUTERS TO GUESS.



“Best Practices”

- Use a strong password hashing algorithm (PBKDF2, bcrypt)
- Salt passwords when possible
- Encourage long passphrases (longer == stronger)
- Allow all printable characters (☺)
- Enable two-factor authentication
- NIST SP 800-63-3 Digital Identity Guidelines - <https://pages.nist.gov/800-63-3>



Links - Tools

- <https://hashcat.net/hashcat/>
- <https://hashcat.net/wiki/doku.php?id=statsprocessor>
- <https://thesprawl.org/projects/pack/>
- <https://digi.ninja/projects/pipal.php>



Links - Wordlists

- <https://crackstation.net/> (15G)
- <https://haveibeenpwned.com/Passwords> (12G)
- <https://hashes.org/public.php>
- <https://wiki.skullsecurity.org/index.php?title=Passwords>
- <https://blog.g0tmi1k.com/2011/06/dictionaries-wordlists/>
- <https://dumps.wikimedia.org/>
- <https://digi.ninja/projects/cewl.php>
- <https://www.gutenberg.org>
- <https://isubtitles.in/>



Links - Rules

Good non-default rules:

- <https://github.com/praetorian-inc/Hob0Rules>
- <https://github.com/nyxgeek/nyxgeek-rules/tree/master/hashcat-rules>
- <http://contest-2010.korelogic.com/rules-hashcat.html>



Links - Misc

Kraken logo: <http://krakenrobotik.de/>

Machine Learning

- <https://0day.work/using-neural-networks-for-password-cracking/>
- <https://github.com/k3170makan/PyMLProjects/tree/master/passwords>
- <https://www.ece.cmu.edu/~lbauer/papers/2016/usenixsec2016-neural-passwords.pdf>

