black hat USA 2021

DBREACH

Database Reconnaissance and Exfiltration via Adaptive Compression Heuristics

Mathew Hogan

Stanford University

Saba Eskandarian UNC Chapel Hill Yan Michalevsky Anjuna Security

Who We Are



Mathew Hogan

- MS Candidate in CS at Stanford, Security track
- BS in CS from Stanford, Systems track



Yan Michalevsky

- CTO and co-founder at <u>Anjuna.io</u>
- PhD in Security and Crypto from Stanford



Saba Eskandarian

- Assistant Prof. at UNC Chapel Hill
- PhD in Crypto and Security from Stanford

Outline

- 1. Background
- 2. Our Attack
- 3. Roadblocks & Optimizations
- 4. Analysis
- 5. Mitigations
- 6. Conclusion

Background

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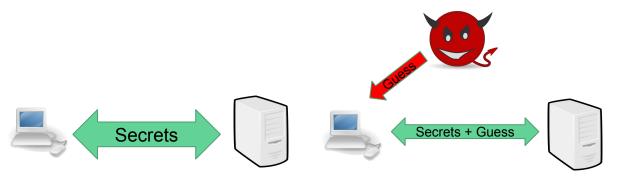
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Key idea: use compression to reveal information about the original content

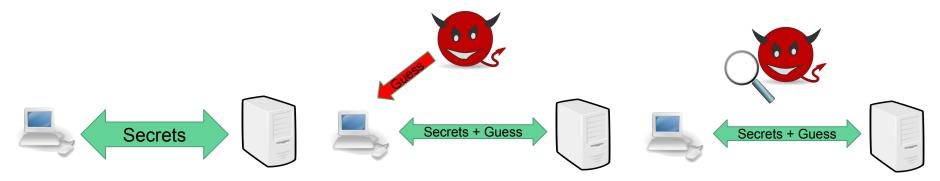
John Kelsey. "Compression and Information Leakage of Plaintext," FSE 2002.



Secret included in encrypted and compressed messages between client and server

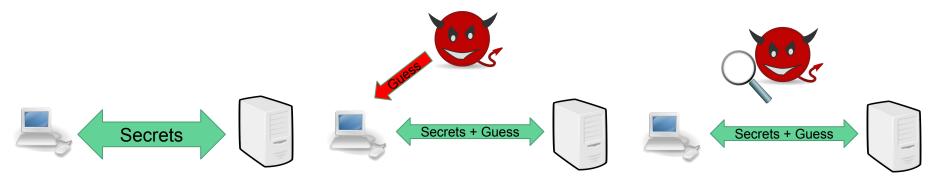


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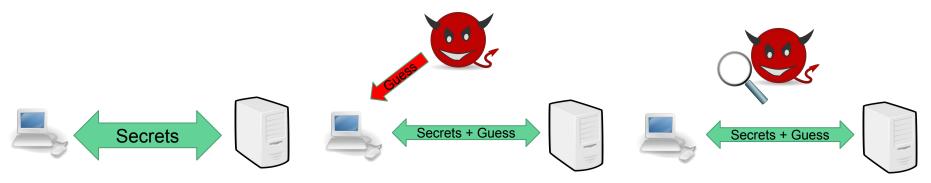
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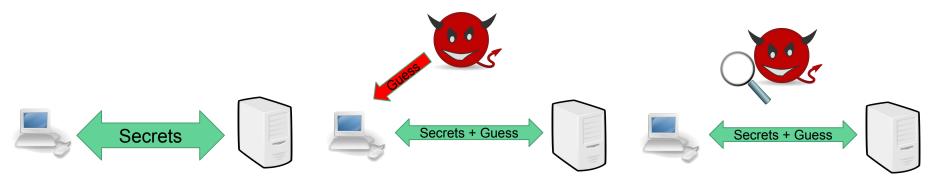
<u>Attack requirement 1:</u> Encryption + Compression Adversary gets client to include its guess in messages to server (e.g., via malicious Javascript) Adversary observes size of encrypted messages to see if guess compresses with secrets



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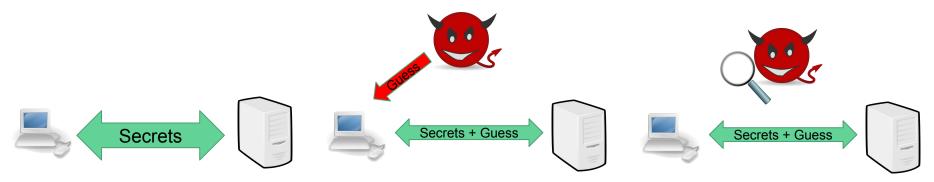
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Where else do all these factors come together?

DBREACH in a Nutshell

Compression side-channel attack against databases

Attacker recovers other users' encrypted content

Extends techniques from CRIME/BREACH beyond TLS to database context

Data-at-Rest Encryption - transparently encrypt data before writing to disk

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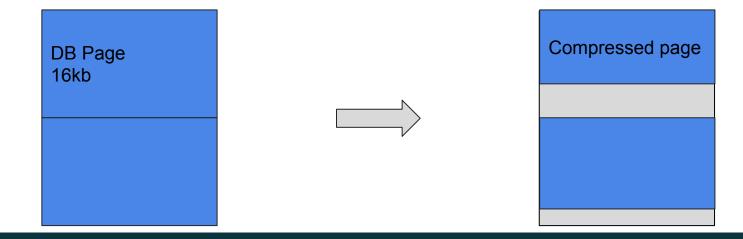
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Compresses data *within* each database page

Uses *hole punching* to save space, only helps when there is enough compression to remove a whole filesystem page

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zlib additionally has a Huffman Coding step

Our Attack

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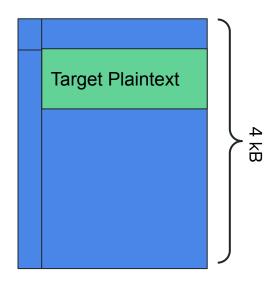
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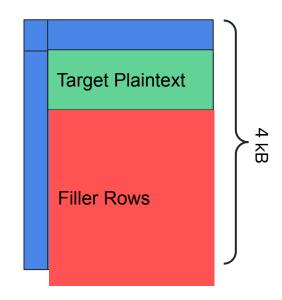
If UPDATE permissions can't be achieved, an attacker with write access can force an update by rolling back the table file and inserting.

Table Layout



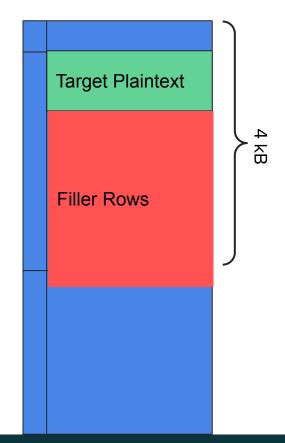
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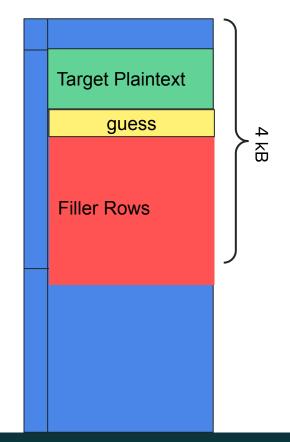


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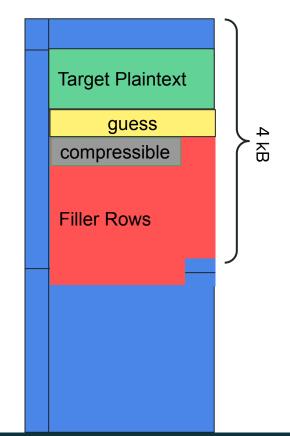
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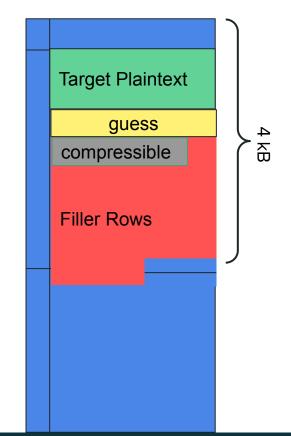
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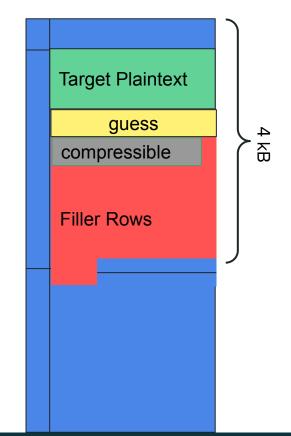
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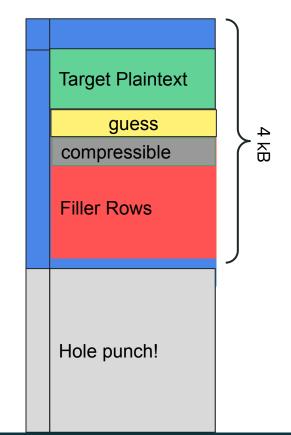
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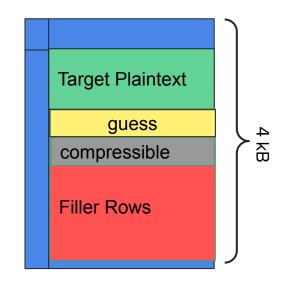
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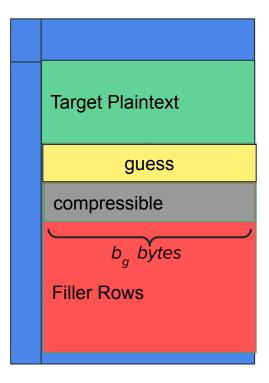
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 - The number of bytes until the table shrinks determines this guess's "compressibility score"



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For a guess g, let b_g be the number of bytes that we made compressible in order to shrink the table.

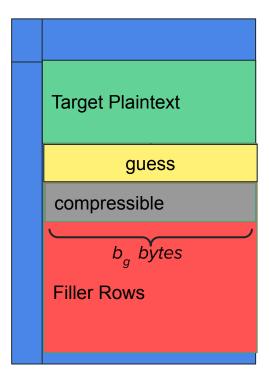


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The compressibility score c_g is calculated as follows:

$$c_g = 1/b_g$$



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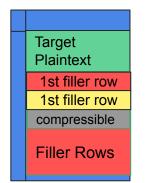
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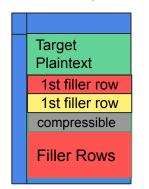
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If a guess's score is within some threshold of \boldsymbol{s}_{ves} , answer "yes"

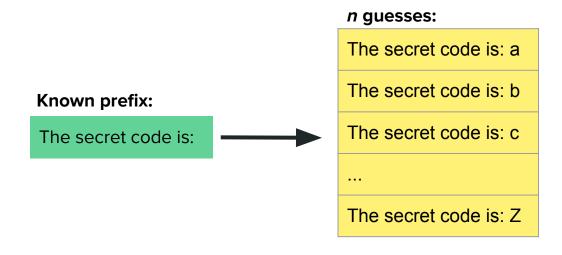
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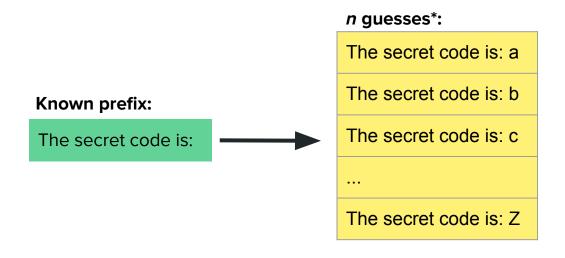
Known prefix:

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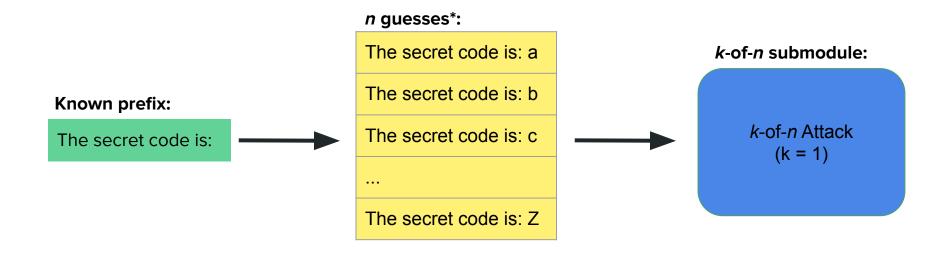


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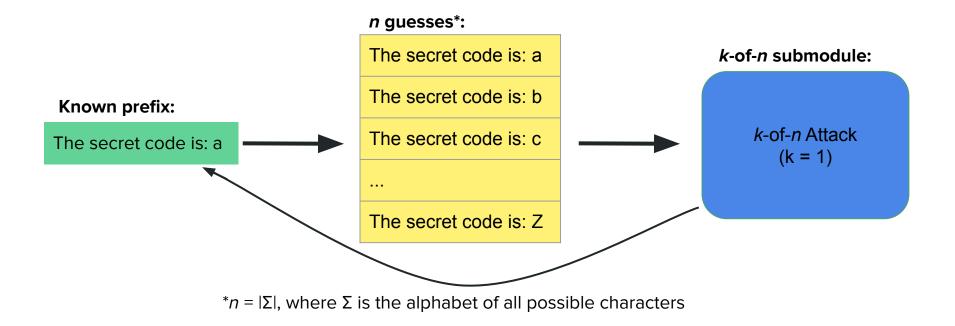
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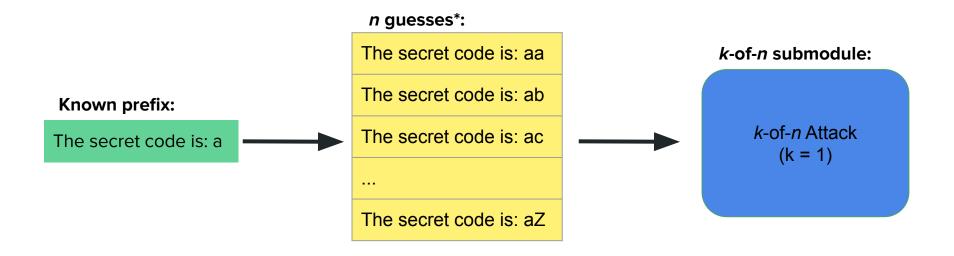


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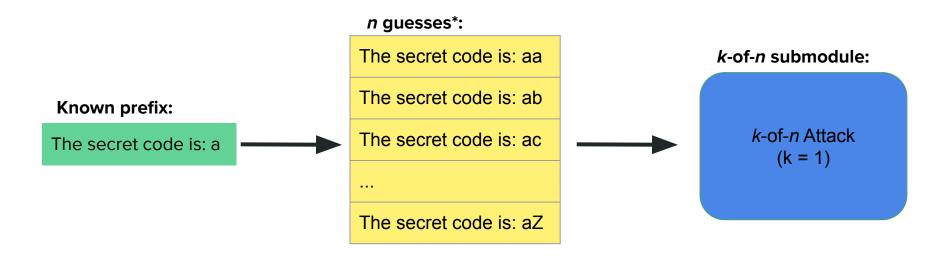
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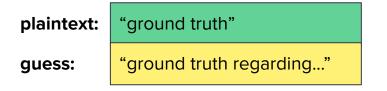


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Still vulnerable to false positives if the superstring is not much longer than the ground truth (recall that we only have to be close to s_{yes} and not precisely match it).

There are multiple sources of noise in the compression side-channel that can lead to false positives or negatives:

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Analysis

Efficiency & Speed

After our binary search optimization, the attack becomes very efficient:

Let *R* be the maximum size of a row

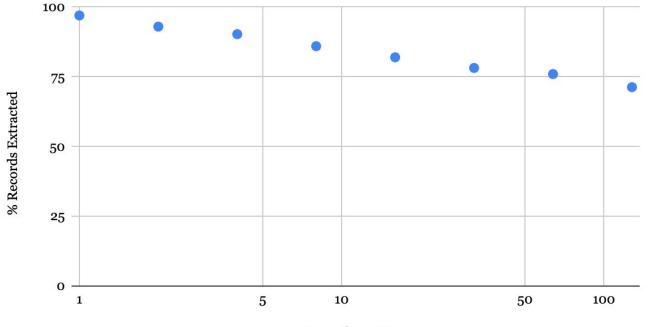
- Insertion of filler rows
 - We must initially insert at most *page_size / R* rows to fill up the page
 - In practice, with an empty page and R = 200, this takes about 30 insertions
- Updates per guess
 - \circ log₂ *R* updates per guess

Thus, for *n* guesses we perform $O(R + n \log R)$ database actions.

In practice, with R = 200, a single guess took 0.2-0.4 seconds.

Accuracy

k-of-n Extraction Accuracy



Records on Page

Vulnerability of Other Systems

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We believe that other RDBMSs and storage engines are vulnerable to the same attack. MySQL is especially likely to be vulnerable.

Mitigations

Recommendations for database administrators & developers using databases:

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Only foolproof solution: **Turn off compression.**

- **Deprecate column-level permissions** for SELECT.
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 - Alternatively, require SELECT permissions on all columns in order to UPDATE.
- Compress only within rows
- Or, compress only within rows inserted by the same user / user group

Demo!

DBREACH

- Attack on compression & encryption in databases
- Simple threat model
- Efficient and accurate

Contact

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