A Coding-Theoretic Approach to Recovering Noisy RSA Keys

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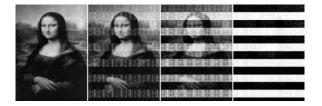
Cold Boot

- Usenix 2008 Halderman et al. noted that DRAMs retain their contents for a while after power is lost.
- Bits in memory can be extracted, but they will have errors.
- 0 bits will always flip with very low probability (<1%), but 1 bits will flip with much higher probability which increases with time.
- For example

Original memory:11000101101101001...Noisy memory:11100001100100001...

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Cold Boot Attacks



- Why is this a problem?
- Secrets may be stored in memory.

The Big Question

Given a noisy RSA key obtained from a cold boot attack, how can we recover the original key?

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Heninger & Shacham (HS) Algorithm (Crypto 2009)

- A PKCS #1 RSA key has the form $(N, e, p, q, d, d_p, d_q, q_p^{-1})$.
- The HS algorithm assumes a noisy PKCS # 1 RSA key has been obtained and some bits of the RSA key are known to be correct.
- The HS algorithm uses algebraic relations between the bits of sk = (p, q, d, d_p, d_q) to generate possible solutions for the next set of bits of the original key.

$$p[i] + q[i] = c_1 \mod 2$$

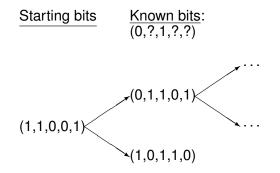
$$d[i + \tau(k)] + p[i] + q[i] = c_2 \mod 2$$

$$d_{\rho}[i + \tau(k_{\rho})] + \rho[i] = c_3 \mod 2$$

$$d_q[i + \tau(k_q)] + q[i] = c_4 \mod 2,$$

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HS Expansion Phase



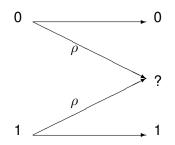
 Given enough time the algorithm always recovers the original key.

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• From our perspective, the HS algorithm considers a key degraded according to an erasure channel:



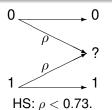
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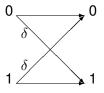
 If *ρ* < 0.73 the algorithm is provably efficient with high probability.

Henecka, May & Meurer (HMM) Algorithm (Crypto 2010)

- HMM assume that each bit of sk can flip with probability δ .
- The HMM algorithm considers 2^t sets of candidate solutions on 5t bits obtained by solving the HS equations on t consecutive positions.
- For each candidate solution on 5*t* bits the HMM algorithm counts the number of bit matches with the noisy RSA key and discards a candidate if there are less than *C* matches.
- The expansion and pruning phases are iterated on remaining candidates until we have recovered solutions across all bits of the RSA key.
- Asymptotically, when $\delta < 0.237$ the algorithm is provably efficient and recovers sk with reasonable success probability.

The Three (Implicit) Models



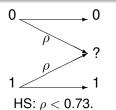


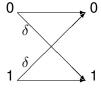
HMM: $\delta < 0.237$.

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The Three (Implicit) Models



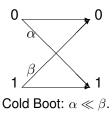


HMM: *δ* < 0.237.

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These channels are not appropriate for cold boot!



Questions We Address

Questions

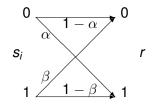
- HS is provably efficient when ρ < 0.73 and HMM is provably efficient when bits flip with probability δ < 0.237. Is there an underlying explanation for these constants?
- Can the results be improved further, and are there ultimate noise limits which no algorithm can handle?

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• Can we design an algorithm that is applicable to the motivating cold boot scenario?

Our Perspective

- We view the situation as a problem in coding theory.
- We consider the set {s_i}_{i∈1} of partial candidates as a code.
 One of these s_i is the correct RSA key which is degraded when retrieved via a cold boot attack.

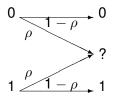


Our Perspective

- If we have obtained r via a cold boot attack, we wish to decode and identify the key s_i that was degraded.
- We are able to use standard results such as Shannon's noisy channel coding theorem to derive bounds on efficiency.
- This perspective enables us to analyse realistic cold boot attacks.

Erasure Channel

• The HS algorithm is concerned with the erasure channel.



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- The capacity of this channel is 1ρ .
- The rate of the code is 0.2.

Erasure Channel

- The converse to Shannon's noisy channel coding theorem says that no algorithm that outputs a single codeword can reliably decode *r* when $1 \rho \le 0.2$.
- Hence, for reliable decoding we must have $\rho < 0.8$.
- By contrast, HS managed $\rho < 0.73$.

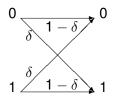
Key Result

For list decoding it can be shown that, on average, an exponential list of candidates will need to be considered when the code rate exceeds capacity.

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Binary Symmetric Channel

• The algorithm of HMM is a decoding procedure for the binary symmetric channel.



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- The capacity is $C = 1 H_2(\delta)$.
- The code rate is at least 0.2.

Binary Symmetric Channel

- Applying Shannon's theorem, an algorithm that outputs a single codeword cannot reliably decode when 1 − H₂(δ) ≤ 0.2.
- Hence, only $\delta < 0.243$ is feasible.
- Note that HMM can handle $\delta < 0.237$.

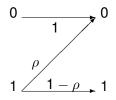
Key Result

When $\delta \ge 0.243$ it can be shown that no algorithm can list decode using a polynomially-sized list.

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• An idealised version of a cold boot attack can be modelled by a Z-channel.



- The HS analysis can be applied to this channel to show that an algorithm keeping **all** 'correct solutions' will be efficient when $\rho < 0.46$.
- The capacity bound on ρ for this channel is approximately 0.666.

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Our New Algorithm

From all the candidate solutions {*s_i*}_{*i*∈*i*} we wish to find

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\max_{i} \mathbb{P}(\mathbf{s}_{i} \mid \mathbf{r}),
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where r is the noisy RSA key.

 Using Bayes' theorem and the assumption that P(s_i) is equal for all *i*, this is equivalent to finding

 $\max_{i} \mathbb{P}(r \mid s_i).$

This can be calculated as

$$\max_{i} \left((1-\alpha)^{n_{00}^{i}} \alpha^{n_{01}^{i}} (1-\beta)^{n_{11}^{i}} \beta^{n_{10}^{i}} \right)$$

• We keep the *L* candidates with the greatest likelihood.



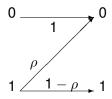
- We will shortly see our experimental results for the Z-channel, the cold boot channel and the binary symmetric channel.
- For each experiment we degraded 100 RSA keys (where each modulus length is 1024 bits) according to the relevant channel.
- We then used our maximum-likelihood algorithm to attempt to recover the noisy RSA keys.

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Idealised Cold Boot

• The capacity bound for ρ is 0.666.

ρ	0.3	0.4	0.46	0.5	0.55	0.6	0.63
Success	1	0.98	0.87	0.81	0.43	0.13	0.03

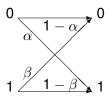


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Cold Boot Scenario

• For these experiments we set $\alpha = 0.001$. The capacity bound for this channel is $\beta = 0.658$.

β	0.2	0.3	0.4	0.5	0.55	0.6	0.61
Success	1	0.97	0.97	0.66	0.31	0.09	0.04

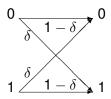


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Henecka, May & Meurer Setting

• The capacity bound for δ is 0.243.

δ	0.08	0.12	0.16	0.2	0.21	0.22
HMM	0.5	0.5	0.35	0.21	-	-
Us	1	0.93	0.84	0.20	0.08	0.04



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Conclusions

- We have considered a more general setting than HS and HMM, which allows us to model true cold boot attacks.
- We have presented a new algorithm that, for practical RSA key sizes, outperforms the HS and HMM algorithms and is applicable to the true cold boot setting.
- We have explored the connections between the cold boot problem and coding theory, using the connections to give bounds on performance and to inspire our new algorithm.