Who watches the watchmen?: Utilizing Performance Monitors for Compromising keys of RSA on Intel Platforms

Sarani Bhattacharya and Debdeep Mukhopadhyay

Indian Institute of Technology Kharagpur



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- Introduction
- Motivation of the problem
- Exponentiation primitives for Public key cryptography
- Modelling branch misses as side-channel
- Formally modeling success probability
- Experimental validation
- Conclusion

• Hardware performance counters (HPCs) are a set of special-purpose registers to store the counts of hardware-related activities within the microprocessor.

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- Hence HPCs can be utilized for both attacks and their countermeasures.
- Asymmetric-key cryptographic algorithms when implemented on systems with branch predictors, are subjected to side-channel attacks exploiting the deterministic branch predictor behaviour due to their key-dependent input sequences.

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- The attack exploits the characteristics of branch predictor and shows formally that the leakage of the key increases with the ability of the attacker to model the predictor more accurately.
- We claim that branch misses from HPCs are indeed more significant side-channels compared to timing.

Why should we consider HPCs for security analysis?

• Results from HPCs are treated as an accurate representations of events occurring in hardware [1], [2].

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- This occurs when the overhead introduced by performance counter interfaces does not dominate the event counts.
- The accuracy depends upon the interface used, the application and the event being measured [1].

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- On the other hand, in [4] data from performance counters are used to develop a malware detector in hardware using machine learning techniques.
- While in [5], a new Virtual Machine Monitor (VMM) named NumChecker is proposed, which exploits HPCs to detect kernel rootkits in a guest Virtual Machine.

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- In 2009, event named 'perf' subsystem was added to the Linux kernel, and makes user access to performance counters less clumsy, without kernel patches or recompiles [9].
- Greatest advantage of Perf event [9] is the subsystem has been already included in the Linux kernel 2.6.31 as "Performance Counters for Linux".

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Public key Cryptography



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Exponentiation and Underlying Multiplication Primitive

 Inputs(M) are encrypted and decrypted by performing modular exponentiation with modulus N on public or private keys represented as nbit binary string.

Square and Multiply Exponentiation

Algorithm 1: Binary version of Square and Multiply Exponentiation Algorithm

```
S \leftarrow M:
for i from 1 to n-1 do
      S \leftarrow S * S \mod N:
      if d_i = 1 then
             S \leftarrow S * M \mod N:
      end
end
return S:
```

 Conditional execution of instruction and their dependence on secret exponent is exploited by the simple power and timing side-channels [10].

Montgomery Ladder Exponentiation Algorithm

- A naïve modification is to have a balanced ladder structure having equal number of squarings and multiplications.
- Most popular exponentiation primitive for Asymmetric-key cryptographic implementations.

Algorithm 2: Montgomery Ladder Algorithm

```
\begin{array}{l} R_0 \leftarrow 1 \ ; \\ R_1 \leftarrow M \ ; \\ \text{for } i \ \text{from } 0 \ \text{to } n-1 \ \text{do} \\ & \text{if } d_i = 0 \ \text{then} \\ & R_1 \leftarrow (R_0 \ast R_1) \mod N \ ; \\ & R_0 \leftarrow (R_0 \ast R_0) \mod N \ ; \\ & \text{end} \\ & \text{else} \\ & R_0 \leftarrow (R_0 \ast R_1) \mod N \ ; \\ & R_1 \leftarrow (R_1 \ast R_1) \mod N \ ; \\ & \text{end} \\ & \text{return } R_0 \ ; \end{array}
```

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Montgomery Multiplication Algorithm

- Highly efficient algorithm for performing modular squaring and modular multiplication operation [11].
- Avoids time consuming integer division operation.
- R is assumed to be 2^k , when N is k-bit number.
- Calculates Z = A * B * R⁻¹(modN), A = a * R(modN), B = b * R(modN) and R⁻¹ * R = 1(modN).

Algorithm 3: Montgomery Multiplication Algorithm

```
\begin{array}{l} S \leftarrow A \ast B ;\\ S \leftarrow (S + (S \ast N^{-1} \mod R) \ast N)/R ;\\ \text{if } S > N \text{ then}\\ S \leftarrow S - N ;\\ \text{end}\\ \text{return } S ;\end{array}
```

Branch Predictor State Machines



Dynamic 2-bit predictor State Machine

- The predictor must miss twice before the prediction changes.
- Conditional branching in regular recurring fashion goes undetected.

Two Level Adaptive Branch Prediction [12]



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- We monitor the branch misses on the square and multiply and Montgomery Ladder algorithm using Montgomery multiplication as subroutine for operations like squaring and multiplication.
- Branch miss rely on the ability of branch predictor to correctly predict future branches to be taken.
- Profiling of HPCs using performance monitoring tools provides simple user interface to different hardware event counts and are considered as side-channel.

Approximating the System predictor with 2-bit branch predictor



Figure: Variation of branch-misses from performance counters with increase in branch miss from 2-bit predictor algorithm

- Direct correlation observed for the branch misses from HPCs and from the simulated 2-bit dynamic predictor over a sample of exponent bitstream.
- This confirms assumption of 2-bit dynamic predictor being an approximation to the underlying system branch predictor.

- In [13], timing attack exploiting branch mispredictions are demonstrated which requires the knowledge of actual structure of branch prediction hardware of the target system.
- Advantage of this attack lies in the fact that adversary, inspite of having no knowledge of the underlying architecture, can actually target real systems and reveal secret exponent bits, exploiting the branch miss as side-channel from HPCs.
- This is an iterative attack, targeting *i*th bit assuming previous bits to be known.
- The attack separates a sample input set based on mispredictions for conditional reduction of Montgomery multiplication at the (i + 1)th squaring step of exponentiation assuming secret ith bit.

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- The attacker knows first *i* bits of the private key and wants to determine next unknown bit d_i of the key (d₀, d₁, ..., d_i, ..., d_{n-1}).
- Generate a trace of branches as $(t_{m,1}, t_{m,2}, \cdots, t_{m,i})$ for conditional reduction of Montgomery multiplication at every squaring step.
- Under the assumption of d_i having value j, where $j \in \{0, 1\}$, appropriate value of $t_{m,i+1}^j$ is simulated.

Offline Phase of the Attack



Figure: Partitioning randomly generated Ciphertexts set based on simulated Branch miss Modelling

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- $M_1 = \{m | m \text{ does not cause a miss during MM of } (i + 1)^{th} \text{ squaring if } d_i = 1\}$
- *M*₂ = {*m*|*m* causes a misprediction during MM of (*i* + 1)th squaring if *d_i* = 1}
- 3 $M_3 = \{m | m \text{ does not cause a miss during MM of } (i + 1)^{th} \text{ squaring if } d_i = 0\}$
- $M_4 = \{m | m \text{ causes a misprediction during MM of } (i + 1)^{th} \text{ squaring if } d_i = 0\}$

We ensure that there must be no common ciphertexts in sets (M_1, M_3) and (M_2, M_4) and the sets should be disjoint.

The probable next bit is decided following the Algorithm 4.

- If $(avg(\mathcal{M}_{M_2}) > avg(\mathcal{M}_{M_1}))$ and $(avg(\mathcal{M}_{M_4}) < avg(\mathcal{M}_{M_3}))$, then the next bit $(nb_i) = 1$
- Otherwise, if $(avg(\mathcal{M}_{M_4}) > avg(\mathcal{M}_{M_3}))$ and $(avg(\mathcal{M}_{M_2}) < avg(\mathcal{M}_{M_1}))$ then, next bit $(nb_i) = 0$

Algorithm 4: Adversary Attack Algorithm

```
Input: (d_0, d_1, \dots, d_{i-1}), M
Output: Probable next bit nb;
begin
       Offline Phase:
       for \forall m \in M do
               Generate taken / not-taken trace for input m as t_{m,1}, t_{m,2}, \cdots, t_{m,i};
               Assume d_i = 0 and 1, generate t_{m,i+1}^0, t_{m,i+1}^1 respectively;
              p_{m,i+1} = T(t_{m,1}, t_{m,2}, \cdots, t_{m,i});
              if p_{m,i+1} = t_{m,i+1}^1 then
                      Add m to M_1;
               end
              else
                      Add m to M_2;
              end
              if p_{m,i+1} = t_{m,i+1}^0 then
                      Add m to M_2:
              end
               else
                      Add m to M_A:
               end
       end
       Remove Duplicate Ciphertexts in the sets M_1, M_3 and M_2, M_4;
       Online Phase:
       Observe distribution of branch misses from performance counters as \mathcal{M}_{M_1}, \mathcal{M}_{M_2}, \mathcal{M}_{M_2}, \mathcal{M}_{M_4};
       if (avg(\mathcal{M}_{M_2}) > avg(\mathcal{M}_{M_1})) and (avg(\mathcal{M}_{M_4}) < avg(\mathcal{M}_{M_3})) then
              nb_{i} = 1:
       end
       if (avg(\mathcal{M}_{M_{d}}) > avg(\mathcal{M}_{M_{3}})) and (avg(\mathcal{M}_{M_{2}}) < avg(\mathcal{M}_{M_{1}})) then
               nb_i = 0:
       end
       return nb; ;
end
```

Formally Modelling the Success Probability

In the offline phase

- Assuming $d_i = 1$ $\Pr[m_1 \in M_1] = \Pr[p_{m_1,i+1} = t^1_{m_1,i+1}]$ $\Pr[m_2 \in M_2] = \Pr[p_{m_2,i+1} \neq t^1_{m_2,i+1}]$
- Assuming $d_i = 0$ $\Pr[m_3 \in M_3] = \Pr[p_{m_3,i+1} = t^0_{m_3,i+1}]$ $\Pr[m_4 \in M_4] = \Pr[p_{m_4,i+1} \neq t^0_{m_4,i+1}]$
- After removing duplicates, $t_{m,i+1}^0 \neq t_{m,i+1}^1$.

In the online phase

Let nb_i be the bit which the attacker concludes to be the next secret bit. Let the expectation of the distribution of branch misses $(\mathcal{M}_M, \forall m \in M)$ be $\overline{\mathcal{M}_M}$. Thus, $\Pr[nb_i = 0] = \Pr[(\overline{\mathcal{M}_{M_4}} - \overline{\mathcal{M}_{M_3}}) > 0 \land (\overline{\mathcal{M}_{M_2}} - \overline{\mathcal{M}_{M_1}}) < 0]$ $\Pr[nb_i = 1] = \Pr[(\overline{\mathcal{M}_{M_2}} - \overline{\mathcal{M}_{M_1}}) > 0 \land (\overline{\mathcal{M}_{M_4}} - \overline{\mathcal{M}_{M_3}}) < 0].$

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- Let $(i + 1)^{th}$ branch predicted by the real predictor for input *m* is $r_{m,i+1}$.
- Let $i + 1^{th}$ branch instruction has trace $B_{m,i+1}$ for unknown bit d_i .
- If $d_i = 0$, then $B_{m,i+1} = t^0_{m,i+1}$, otherwise if $d_i = 1$, $B_{m,i+1} = t^1_{m,i+1}$.
- Thus we can rewrite the previous equation as

$$\begin{aligned} & \Pr[nb_i = 0] = \Pr[(\overline{\mathcal{M}_{M_4}} - \overline{\mathcal{M}_{M_3}}) > 0 \land (\overline{\mathcal{M}_{M_2}} - \overline{\mathcal{M}_{M_1}}) < 0] \\ &= \Pr[(r_{m_4,i+1} \neq B_{m_4,i+1}) \land (r_{m_3,i+1} = B_{m_3,i+1}) \land (r_{m_2,i+1} = B_{m_2,i+1}) \land (r_{m_1,i+1} \neq B_{m_1,i+1})] \end{aligned}$$

Formally Modelling the Success Probability

$$\begin{aligned} \mathsf{Pr}(\mathsf{Success}) &= \mathsf{Pr}[nb_i = d_i] \\ &= \mathsf{Pr}[nb_i = 0 \land d_i = 0] + \mathsf{Pr}[nb_i = 1 \land d_i = 1] \\ &= \mathsf{Pr}[nb_i = 0 \mid d_i = 0] \cdot \mathsf{Pr}[d_i = 0] + \mathsf{Pr}[nb_i = 1 \mid d_i = 1] \cdot \mathsf{Pr}[d_i = 1] \end{aligned}$$

If $d_i = 0$, we replace $B_{m,i+1} = t_{m,i+1}^0$ in Equation 1 as,

Substituting the events from Offline Phase,

$$\Pr[nb_i = 0 \mid d_i = 0] = \Pr[(r_{m_4,i+1} = \rho_{m_4,i+1}) \land (r_{m_3,i+1} = \rho_{m_3,i+1}) \land (r_{m_2,i+1} = \rho_{m_2,i+1}) \land (r_{m_1,i+1} = \rho_{m_1,i+1})] = \Pr[(r_{m,i+1} = \rho_{m,i+1})]$$

Similar calculations reveal,

$$\Pr[nb_i = 1 \mid d_i = 1] = \Pr[(r_{m,i+1} = p_{m,i+1})]$$

Combining equations we get,

$$\begin{aligned} \mathsf{Pr}(\mathsf{Success}) &= \mathsf{Pr}[r_{m,i+1} = p_{m,i+1}] \cdot [\mathsf{Pr}(d_i = 0) + \mathsf{Pr}(d_i = 1)] \\ &= \mathsf{Pr}[r_{m,i+1} = p_{m,i+1}] \end{aligned}$$

Thus the probability of success is equal to the probability that the theoretical predictor closely models the real predictor.

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- A large input set is separated by simulations over bimodal and two-level adaptive predictor.
- Average branch misses are observed from HPCs for each elements in set M_1 , M_2 , M_3 and M_4 .
- Each set has L = 1000 elements.
- Experiment is repeated over I = 1000 iterations.
- Experiments are performed on various platforms as Core-2 Duo E7400, Intel Core i3 M350 and Intel Core i5-3470.

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Experiments on Square and Multiply Algorithm



Figure: Branch misses from HPCs on square and multiply correctly identifies secret bit $d_i = 1$, ciphertext set partitioned by simulated misses of two-level adaptive predictor

Experiments on Montgomery Ladder



Figure: Branch misses from HPCs on Montgomery Ladder correctly identifies secret bit $d_i = 1$, ciphertext set partitioned by simulated misses of two-level adaptive predictor

Comparison with timing as side-channel



Figure: No identification of secret bit is possible using timing as side-channel with L = 1000and I = 1000

Variation of parameters such as Number of Inputs (L) and Iteration (I) $% \left(L\right) =\left(L\right) \left(L\right) \left($

Variation in separation with increase of Ciphertexts



(a) Correct Assumption $d_i = 1$

(b) Incorrect Assumption $d_i = 0$

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Figure: Variation in the separation of branch misses for correct secret bit = 1 showing positive difference for M_1 and M_2 with the increase in number of ciphertexts(L), I = 100

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Variation in separation with increase of Iterations



Figure: Variation in the separation of branch misses for correct secret bit = 0 showing positive difference for M_3 , M_4 with the increase in number of iteration(I), L = 1000

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RSA-OAEP Randomized Padding Scheme



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Separation for RSA-OAEP scheme



(a) Correct Assumption $d_i = 1$

(b) Incorrect Assumption $d_i = 0$

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Figure: Branch misses from HPCs on RSA-OAEP implementation, correctly identifies secret bit $d_i = 1$, ciphertext set partitioned by simulated misses of bimodal predictor

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- If input to MM algorithm is masked such that 2 random numbers r_1, r_2 generated at runtime and inputs are modified as $(a_r = a + r_1)$ and $(b_r = b + r_2)$, the branch predictor observes branches which depend on r_1, r_2 . This masking strategy will prevent the adversary from simulating branch miss, since r_1, r_2 are randomly generated at run time.
- The effect of r_1, r_2 can be nullified by adding correction terms.
- There are other implementations of RSA, like CRT-RSA, can be more resistant, since the adversary cannot perform the necessary subsimulations (without knowing the prime factors of the RSA modulus).
- However, in presence of stronger fault models performance counters pose to be a threatening side channel.

• Experiments show that HPCs form threatening side-channel for existing implementations of RSA-like ciphers and similar implementations.



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