

# Probabilistic Primality Testing and Analysis of Probabilistic AKS

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# Introduction

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## Abstract

This paper aims to analyze the Fermat, the Euler (Solovay-Strassen), and the Miller-Rabin primality tests, three well-known probabilistic algorithms based on Fermat's little theorem. The Agarwal-Kayal-Saxena test, the first polynomial time deterministic primality test developed, is also discussed, as well as a proposal for a new probabilistic adaptation. This probabilistic AKS was found to deliver significant running time decreases, at the expense of eliminating determinism and passing a considerable amount of pseudoprimes.

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- In layman's terms: looked at a variety of tests for checking if a number is prime, and analyzed their performance with regards to speed and accuracy

# Primality Testing

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  - Used in verifying prime numbers
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  - Generates a random number, runs through primality test, if prime, then OK for use
- Well-known primality tests include the Fermat, Euler (Solovay-Strassen), Miller-Rabin, and Agarwal-Kayal-Saxena (AKS) tests

# Probabilistic vs Deterministic

- The first three tests mentioned above (Fermat, Euler, and Solovay-Strassen) are probabilistic
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  - Often much slower, especially as we'll see with the AKS test
  - High performance demands where 100% accuracy can be sacrificed
- Research goal: how can we take the best of both worlds of probabilistic and deterministic tests?

# Background Theory

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- Assumes a basic knowledge of modular congruences
- All  $\log n$  shown are  $\log_2 n$  unless otherwise marked

# Fermat Primality Test

- Relies on Fermat's Little Theorem: for any integer  $a$  and any prime  $p$ ,

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  - Passing higher  $k$  values indicates a higher probability that the number is prime
- However, certain composite numbers (like Carmichael numbers) pass Fermat's primality test
  - This means there's a chance a *pseudoprime* will be passed

# Fermat Primality Test

- This algorithm runs in  $O(k \times \log n)$  time complexity
  - Each of the modular exponentiations takes  $O(\log n)$ , and there are  $k$  exponentiations



# Euler Primality Test

- Utilizes on Euler's Theorem: for any integer  $a$  and any prime  $p$  where  $a$  and  $p$  are coprime,

$$a^{\phi(n)} \equiv 1 \pmod{p}$$

- The  $\phi(n)$  function is the totient function, which returns  $p - 1$  for all prime  $p$
- This is a generalization of Fermat's Little Theorem

# Euler Primality Test

- Since  $a^{\phi(n)} \equiv 1 \pmod{p}$ ,  $a^{\phi(n)/2} \equiv 1 \pmod{p}$  is

$$a^{\phi(n)/2} \equiv \begin{cases} 1 \pmod{n} & \text{when } x \text{ s.t. } a \equiv x^2 \pmod{n} \\ -1 \pmod{n} & \text{when no such integer.} \end{cases}$$

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  - More accurate than Fermat, but there remains a chance a pseudoprime is passed
- The Euler test runs in  $O(k \times \log^3 n)$  time complexity
  - Each of the coprime to  $n$ , Jacobi symbol, and modular exponentiations checks takes  $O(\log n)$ , so  $\log n$  has a power of 3, and there are  $k$  bases to check

# Miller-Rabin Primality Test

- The Miller-Rabin Primality test uses different congruences instead, checking for:

$$a^d \equiv 1 \pmod{n}$$

$$a^{(2^r \times d)} \equiv -1 \text{ for some } r \text{ such that } 0 \leq r < s$$

where  $n$  is rewritten as  $2^s \times d + 1$  and  $0 \leq a \leq n$ .

- $n - 1 = 2^s \times d$ , so if  $a^d \equiv \pm 1 \pmod{n}$ ,  $n$  is a *strong probable prime*
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  - Between  $10^5$  and  $10^6$ , 167 Fermat, 78 Euler, and 30 strong pseudoprimes found [6]
- The Miller-Rabin test also runs in  $O(k \times \log^3 n)$  time complexity



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- Based on the theorem that for any  $a$  where  $a$  is coprime to  $n$  and where  $n \geq 2$ , the following holds within the polynomial ring  $\mathbb{Z}[x]$ :

$$(X + a)^n \equiv X^n + a \pmod{n}$$

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  - Check  $n \leq r$ ; if so,  $n$  is prime.
  - Compute all  $(X + a)^n \equiv X^n + a \pmod{n}$  for  $1 \leq a \leq \lfloor \sqrt{\phi(r)} \log n \rfloor$ ; if  $n$  passes all these tests, it is prime, otherwise it is composite.



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- Probabilistic AKS: this research project's proposal for a new variant of AKS
  - Instead of checking all  $a$   $1 \leq a \leq \lfloor \sqrt{\phi(r)} \log n \rfloor$ , choose  $k$  random  $a$  values from that range to check
  - Similar idea as the random choice of  $a$  in the Fermat, Euler, and Miller-Rabin tests

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- With  $r$ 's lower bound proven as  $2 + \log^2 n$  [10], this could be as low as  $\tilde{O}(k \times \log^4 n)$

# Analysis Methods

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- To consistently analyze the four primality tests (AKS was not tested for pseudoprimes as it is proven correct and would have taken too long), integers in the range  $10^5 \leq x \leq 10^6$  were randomly chosen
  - For the Fermat, Euler, and Miller-Rabin tests,  $10^4$  integers were chosen
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- Ran the primality test with a variety of  $k$  values

- Sympy's `isprime` function was used as a reference to test for primality
  - The numbers marked as prime by the primality test being analyzed were compared with the `isprime` results

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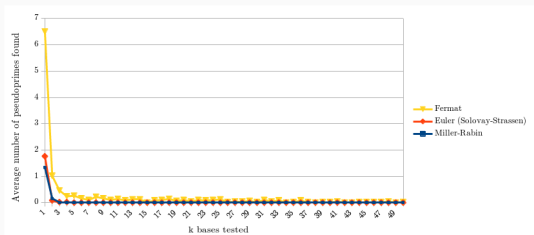
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- All the data collected can be found at [kewbish/srs](https://github.com/kewbish/srs) on GitHub

# Results

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# Average pseudoprimes vs. $k$ base trials

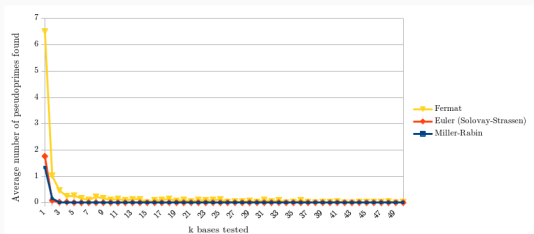
**Figure 1:** The effect of increasing the number of base trials  $k$  on pseudoprimes passed



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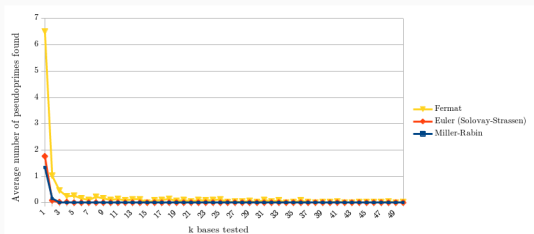


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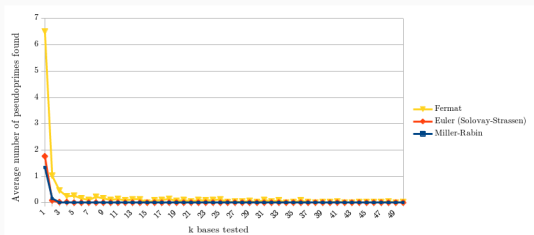
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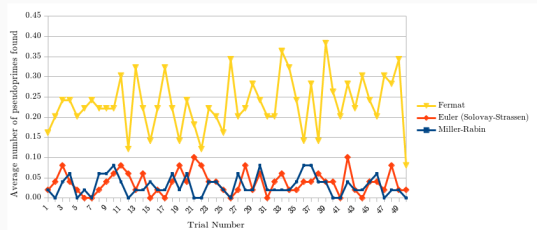
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- Both Euler and Miller-Rabin consistently pass 0 pseudoprimes at higher  $k$  values

# Average pseudoprimes vs. trial number

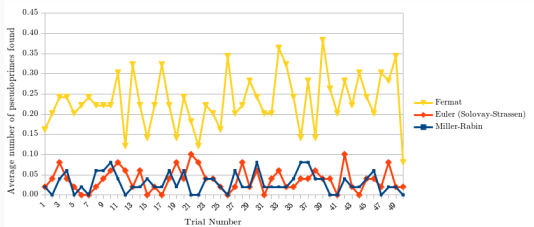
**Figure 2:** Average pseudoprimes passed across all  $1 \leq k \leq 50$  values per trial



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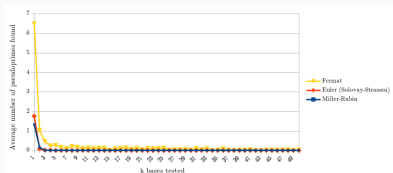
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- Miller-Rabin has the smallest range of numbers of pseudoprimes passed

# Probabilistic primality tests - accuracy

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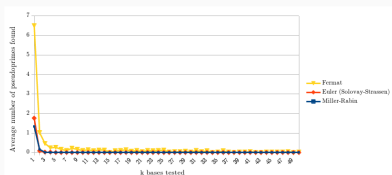
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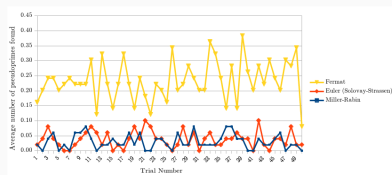
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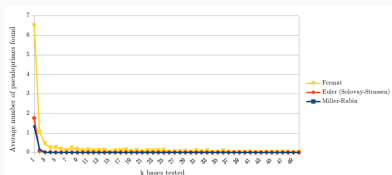
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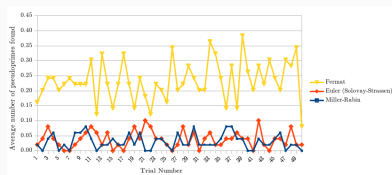
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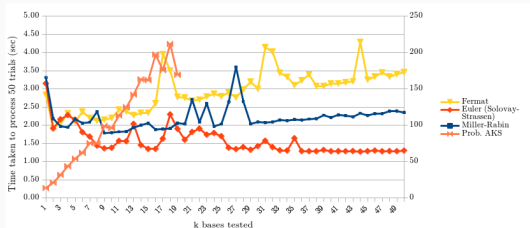
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- Fermat consistently passed more pseudoprimes
- Euler and Miller-Rabin appear to perform quite similarly but on average Euler will pass more pseudoprimes
- Supported by the results of Pomerance, Selfridge, and Wagstaff, as well as by Monier's findings [6][4]

# Running time vs. $k$ base trials

**Figure 3:** The effect of increasing the number of base trials  $k$  on running time elapsed

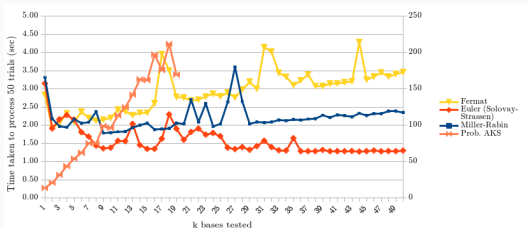


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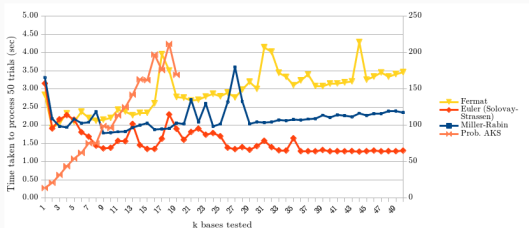
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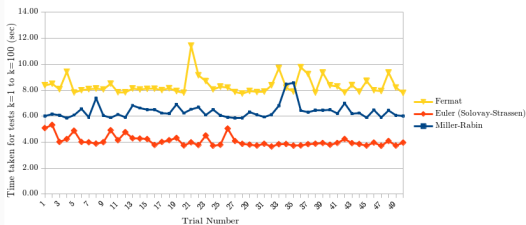
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- Contrasts theoretical runtime where the expectations were  $\text{Fermat} < \text{Euler} = \text{Miller-Rabin}$

# Running time vs. trial number

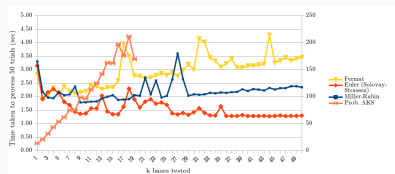
**Figure 4:** Running time elapsed across all  $1 \leq k \leq 100$  values per trial



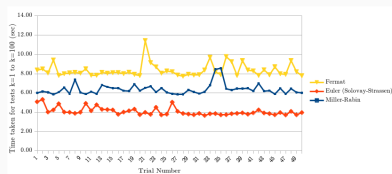
- Again, contrasts expectations, with Euler outperforming Miller-Rabin, which was in turn faster than Fermat

# Probabilistic primality tests - runtime

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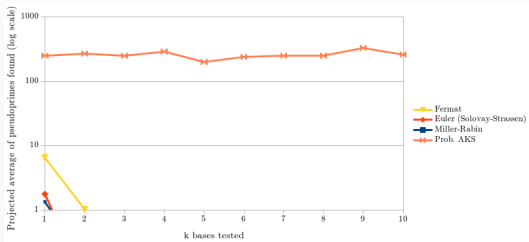
**Figure 4:** Average pseudoprimes passed across all  $1 \leq k \leq 50$  values per trial



- A possible explanation for more efficient runtime of Euler and Miller-Rabin is the speed at which numbers are discarded as composite
  - The congruences used in the Euler and Miller-Rabin tests may do so more quickly - though this has not been theoretically verified yet

# Projected pseudoprimes vs. $k$ value

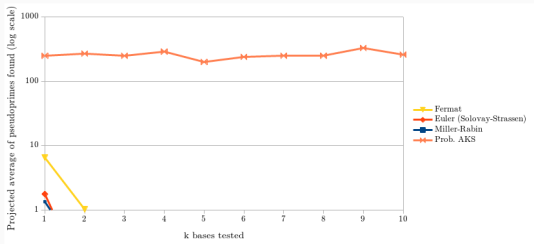
**Figure 5:** Projected average number of pseudoprimes passed by probabilistic AKS versus other tests



- Significant increase in number of projected pseudoprimes passed by probabilistic AKS compared to the existing tests ( 200 vs.  $<10$ )
  - Projection method: multiply pseudoprimes found by  $10^2$

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  - Projection method: multiply pseudoprimes found by  $10^2$
- Due to the relatively very low  $k$  values tested for probabilistic AKS

# $k$ value trials for probabilistic AKS

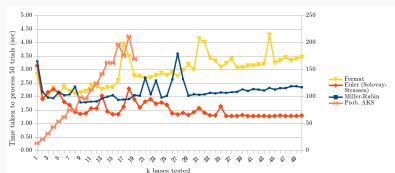
**Table 1:** Number of pseudoprimes passed at given  $k$  values

k-value	Pseudoprimes passed							Average pseudoprimes
	0	1	2	3	4	5	6	
100	0	1	2	1	3	0	2	3.4
200	1	0	4	0	3	0	0	2.6
300	3	0	4	1	1	0	0	1.7
400	4	0	4	2	0	0	0	1.4

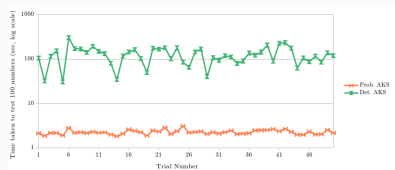
- Downward trends for pseudoprimes passed also observed for probabilistic AKS
  - The  $k$  values required to pass low pseudoprimes are significantly higher than that of the existing probabilistic tests due to the nature of the deterministic AKS algorithm

# Running time of probabilistic AKS

**Figure 3:** The effect of increasing the number of base trials  $k$  on pseudoprimes passed



**Figure 7:** Elapsed running time for probabilistic versus deterministic AKS

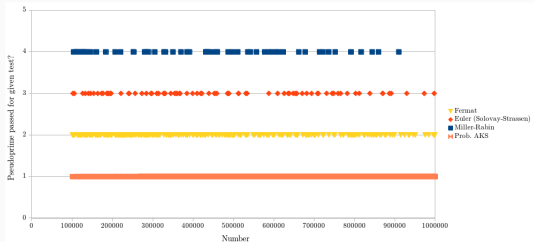


- Probabilistic AKS is considerably slower than the existing primality tests, but also significantly faster than deterministic AKS
  - Discrepancies in runtime from probabilistic AKS and existing primality tests can be attributed to time complexity



# All pseudoprimes passed $10^5 \leq x \leq 10^6$

**Figure 8:** Distribution of pseudoprimes found between  $10^5$  and  $10^6$  for probabilistic primality tests



- AKS passes by far the greatest pseudoprimes (11524), followed by Fermat (274), Euler (81), and Miller-Rabin (63)
- Contrasts with Pomerance et al.'s findings, but may be attributed to base analysis differences [6]

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  - Potentially misleading `isprime` SymPy function used; also relies on probabilistic methods

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- Deterministic AKS: no pseudoprimes passed, and very slow to run  $\rightarrow$  good for applications where speed is irrelevant
- Probabilistic AKS: high numbers of pseudoprimes passed at low  $k$ , much faster than deterministic AKS  $\rightarrow$  may provide a suitable alternative to deterministic AKS for more practical applications given high enough  $k$  values



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