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Can we relax the security definition in a meaningful way?

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• It is more likely that the next meteorite that hits Earth lands in this square

Do we need to be concerned?

- We allow secrecy to fail with some tiny probability
- We only restrict our attention to "efficient" attackers

Our starting point is the following (equivalent) definition of perfect secrecy:

Definition: A private key encryption scheme $\Pi = (Gen, Enc, Dec)$ with message space \mathcal{M} is **perfectly indistinguishable** if for every \mathcal{A} it holds:

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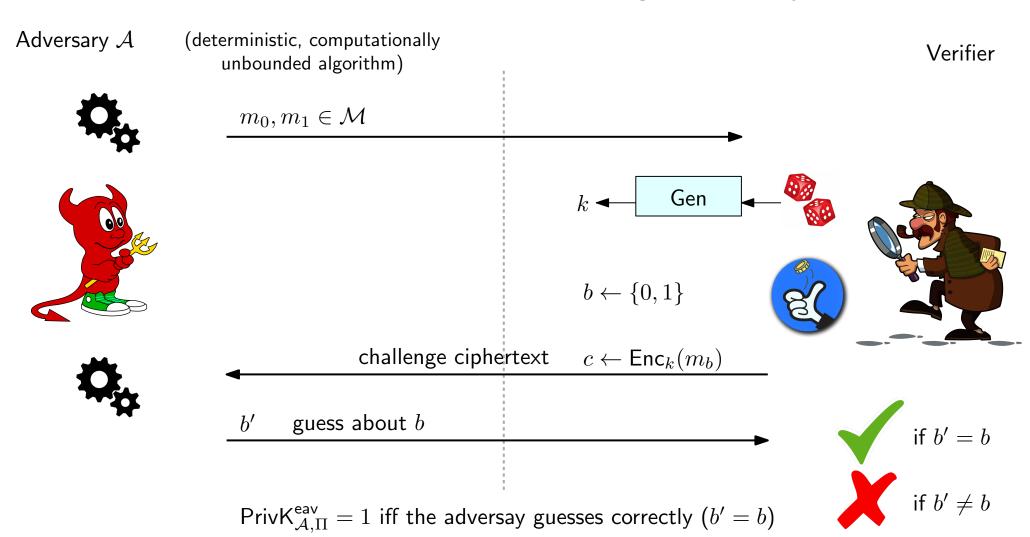
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Two possible approaches:

- Concrete
- Asymptotic

Reminder: Perfect indistinguishability



Computational secrecy (concrete)

Candidate definition: A private key encryption scheme $\Pi = (Gen, Enc, Dec)$ is (t, ε) -indistinguishable if for every attacker \mathcal{A} running in time at most t, it holds that:

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Observation: $(\infty, 0)$ -indistinguishability is equivalent to perfect indistinguishability

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Does not lead to a clean theory

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Measure probabilities and running times as a function of n

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- ullet We allow secrecy to fail with some tiny probability ullet probabilities that are negligible in n

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" $\eta(n)$ approaches 0 faster than the inverses of <u>all</u> polynomials in n"

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As a special case, the product of two negligible functions is negligible

Negligible and polynomially bounded functions

Which of the following functions are polynomially bounded? Which are negligible?

$$n^2 + 4n - 2$$

$$n^{100}$$

$$n^3 + \cos(n)$$

$$\frac{1}{n^{10}} + 2^{-n/2}$$

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$$\sqrt[3]{n} + \frac{1}{n}$$

$$n^{-n} \cdot (n^5 + n^2)$$

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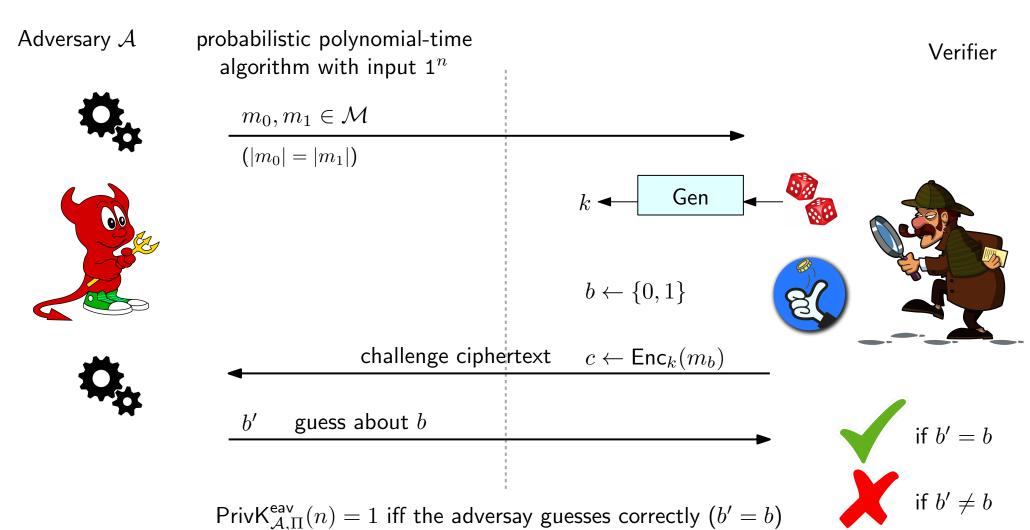
Private-key encryption schemes, redefined

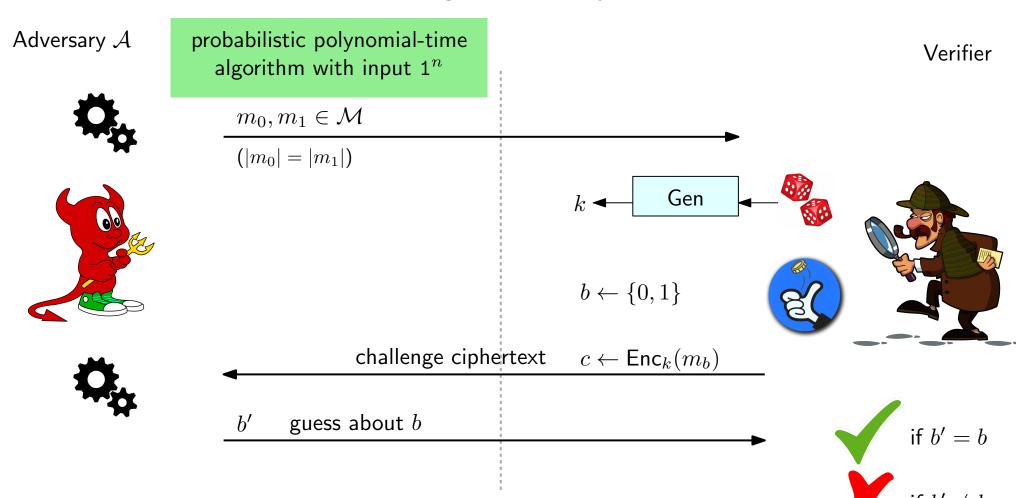
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The default message space \mathcal{M} is $\{0,1\}^*$. A private-key encryption scheme consists of three algorithms:

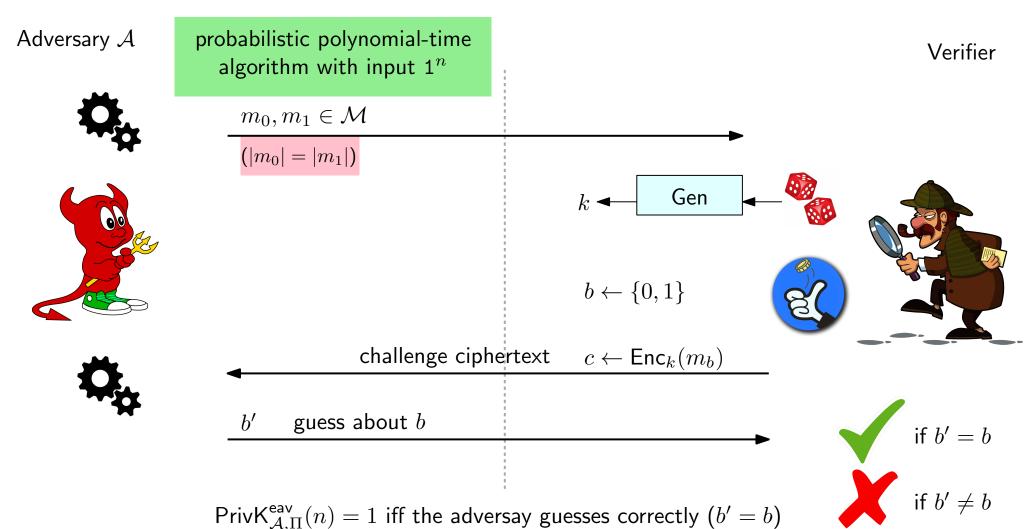
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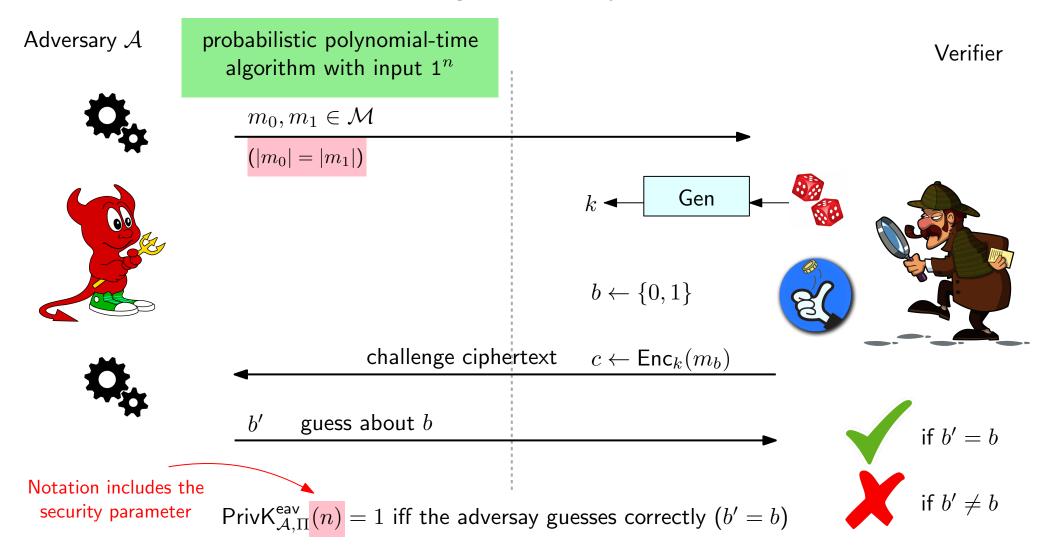
If $M = \{0,1\}^{\ell(n)}$ then (Gen, Enc, Dec) is a **fixed-length** private-key encryption scheme (for messages of length $\ell(n)$)





 $\operatorname{PrivK}^{\operatorname{eav}}_{\mathcal{A},\Pi}(n)=1$ iff the adversay guesses correctly (b'=b)





Definition: A private key encryption scheme $\Pi = (Gen, Enc, Dec)$ has indistinguishable encryptions in the presence of an eavesdropper (is **EAV-secure**) if, for every probabilistic polynomial-time adversary A, there is a negligible function ε such that:

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Observation: perfect indistinguishability implies EAV-security

Consider a scheme where:

- ullet Gen $(\mathbf{1}^n)$ returns a key chosen uniformly at random in $\{0,1\}^n$
- ullet The best possible adversary ${\mathcal A}$ performs a brute-force search over the key space
- If the running time of the adversary is t(n) then:

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Is this scheme EAV-secure? Yes!

For all polynomial running times t(n), all functions in $O\left(\frac{t(n)}{2^n}\right)$ are negligible

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How large do we need to choose n?

n	48	64	128	256	512	1024
running time	2.5 months	6 months	4 years	32 years	255 years	2041 years
probability of success	1 in 256	pprox 1 in 17 mil	$pprox$ 3 in 10^{26}	$pprox$ 3 in 10^{65}	$pprox 1$ in 10^{142}	$pprox$ 2 in 10^{296}

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Not negligible!

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One should still be aware that leaking the plaintext length is. . .

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In Google maps, the map tiles are compressed and (essentially) static. The size of the ciphertext can be used to determine the viewed location

Where do we stand?

- We have a perfectly secret encryption scheme (one-time pad)...
- ... but it requires long keys
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It depends...



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Equivalent assumption: one-way functions (OWF) exist

Inf. Functions that are easy to compute but hard to invert even "on average"



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Donald Knuth Algorithms guy



Whitfield Diffie Crypto guy



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Algorithmica: P = NP or something "morally equivalent" Problems in NP are easy to solve, no OWFs





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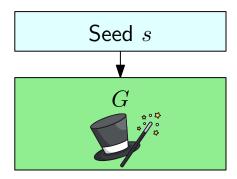


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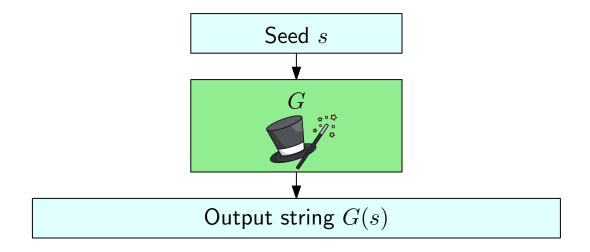




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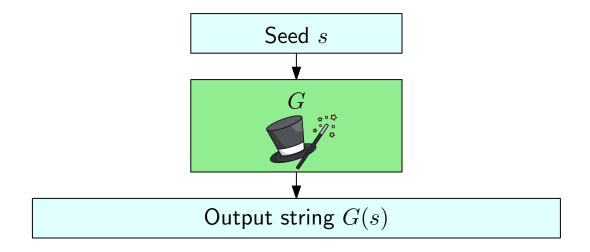


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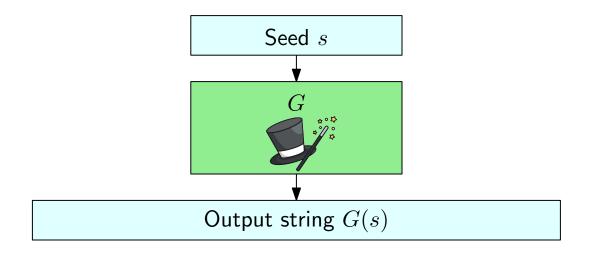
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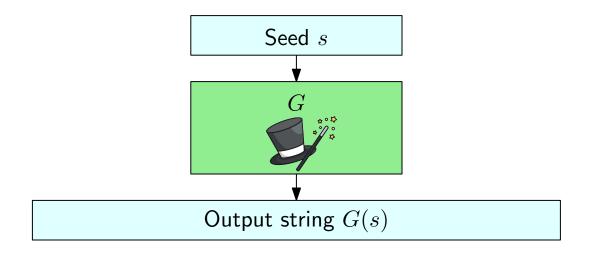


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 \ldots and that x is "pseudorandom" if it is the output of a PRG

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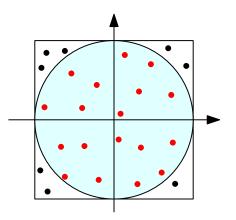
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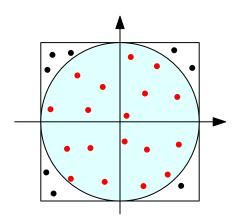
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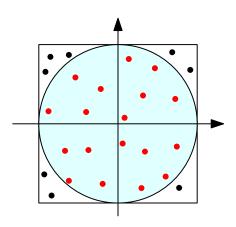


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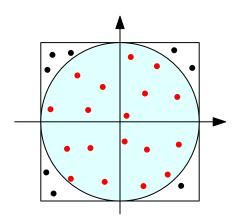
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We would like a PRG to pass all conceivable statistical tests!

Historically, a candidate PRG was considered good if its outputs were able to pass a collection of statistical tests (that would be satisfied by "truly random" strings)

Examples:

- Is the first bit of the output 1 with probability $\approx \frac{1}{2}$?
- Is the parity of any subset of bits 1 with probability $\approx \frac{1}{2}$?
- If I interpret the string as a series of points in a square of side 2 centered in the origin, is the fraction of points within the circle of radius 1 centered in the origin $\approx \pi/4$?



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Is this even possible?

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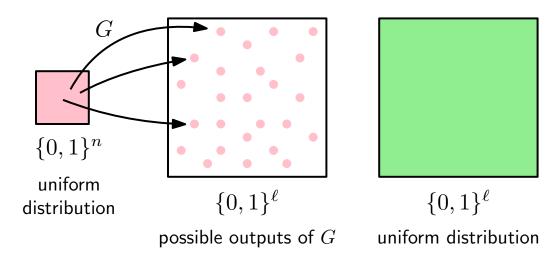
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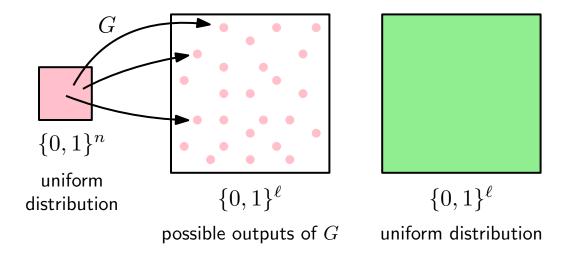
$$2^{\ell} = 2^{\ell - n} \cdot 2^n > 2 \cdot 2^n$$

• At least half of the ℓ -bit strings (actually a $\frac{2^{\ell-n}-1}{2^{\ell-n}}$ -fraction) can never be output by G!



The following test detects whether a string w has been generated from G with probability $\geq \frac{2}{3}$:

- If w = G(s) for some s, guess that w is pseudorandom with probability $\frac{2}{3}$
- ullet Otherwise, guess that w is random

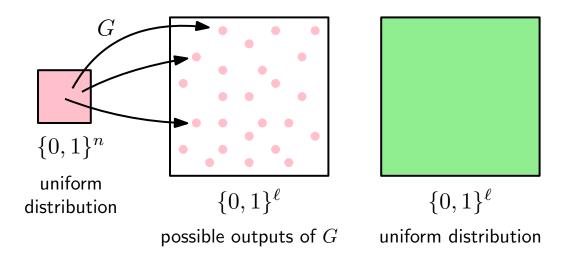


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Pseudorandom strings are correctly identified with probability $\frac{2}{3}$

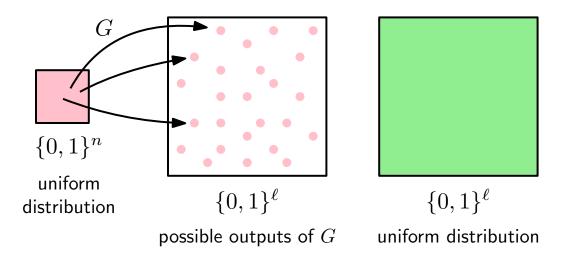
Random strings are correctly identified with probability $\geq \frac{1}{2} \cdot \frac{2}{3} + \frac{1}{2} \cdot 1 = \frac{2}{3}$



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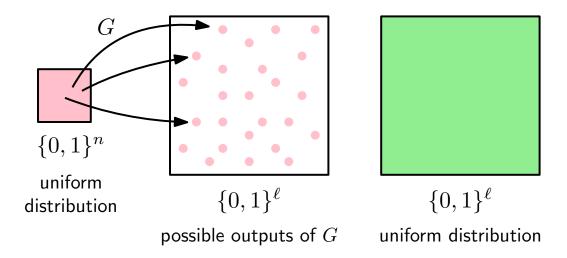


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Idea: If adversaries are polynomially bounded, we only need to pass statistical tests that run in polynomial time



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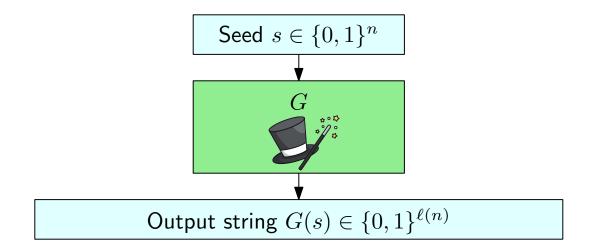
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 $\left|1-\frac{1}{2^{\ell(n)}}\right|$ is not negligible

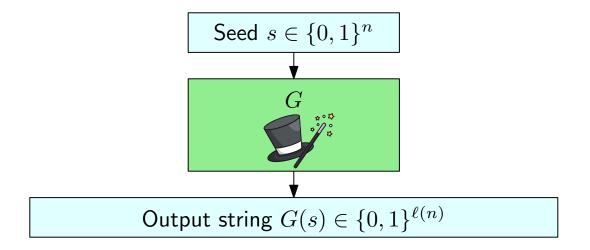
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As far as polynomial-time algorithms are concerned, the output of G(s) with a random seed s is indistinguishable (up to some negligible probability) from a random string r



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If we have a randomized polynomial-time algorithm that uses $\ell(n)$ random bits, and we replace those random bits with the output of G(s), the resulting (randomized) algorithm "behaves the same" except for a negligible probability