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Besides cryptographic random number generators (RNGs), the following are examples of **high-quality pseudorandom number generators (PRNGs)**. The "Fails PractRand Starting At" column in this and other tables in this page means the number of bytes (rounded up to the nearest power of two) at which PractRand detects a failure in the PRNG. (Note that high-quality PRNGs, as I define them, are not necessarily appropriate for information security.)

PRNG		Length	Fails PractRand Starting At	Notes
xoshiro256**	2^256 - 1	2^256 - 1	??? TiB	
xoshiro256+	2^256 - 1	1		Lowest bits have low linear complexity (see (Blackman and Vigna 2019) <sup>(1)</sup> and see also "Testing low bits in isolation"); if the application or library cares, it can discard those bits before using this PRNG's output.
xoshiro256++	1	2^256 - 1		
xoshiro512**	1	2^512 - 1		
xoshiro512+	2^512 - 1	2^512 - 1	??? TiB	Lowest bits have low linear complexity
xoshiro512++	2^512 - 1	2^512 - 1	??? TiB	
xoroshiro128++	2^128 - 1	2^128 - 1	??? TiB	
xoroshiro128**	2^128 - 1		??? TiB	
SFC64 (C. Doty-Humphrey)	2^192	At least 2^64 per seed	??? TiB	256-bit state
Philox4×64-7	2^128	At least 2^256 per seed		384-bit state
Velox3b	2^64	At least 2^128 per seed		256-bit state
gjrand named after Geronimo Jones	2^128	At least 2^64 per seed	??? TiB	256-bit state
MRG32k3a (L'Ecuyer 1999; L'Ecuyer et al. 2002)	Near	2 cycles with length	??? TiB	192-bit state

(2)	2^192	near 2^191		
MRG31k3p (L'Ecuyer and Touzin 2000) <sup>(3)</sup>	Near 2^186	2 cycles with length near 2^185	??? TiB	192-bit state
JLKISS (Jones 2007/2010) (4)	2^64 * (2^64 - 1)^2		??? TiB	192-bit state
JLKISS64 (Jones 2007/2010) <sup>(4)</sup>	2^64 * (2^64 - 1)^3		??? TiB	256-bit state
A multiplicative <b>linear congruential generator</b> (LCG) with prime modulus greater than 2 <sup>63</sup> described in Table 2 of (L'Ecuyer 1999) <sup>(5)</sup>	Modulus - 1	Modulus - 1	??? TiB	Memory used depends on modulus size
XorShift* 128/64	2^128 - 1	2^128 - 1	??? TiB	128-bit state. Described by M. O'Neill in "You don't have to use PCG!", 2017. (6)
XorShift* 64/32	2^64 - 1	2^64 - 1	??? TiB	64-bit state. Described by M. O'Neill in "You don't have to use PCG!", 2017.

# **0.1 PRNGs with Stream Support**

Some PRNGs support multiple "streams" that behave like independent random number sequences. The test for independence involves interleaving two "streams" outputs and sending the interleaved outputs to the PractRand tests.

The following lists high-quality PRNGs that support streams and their PractRand results for different strategies of forming random number "streams".

PRNG	Fails PractRand Starting At	Notes
xoshiro256**	Jump-ahead by 2^64: ??? TiB Jump-ahead by 2^128: ??? TiB Jump-ahead by 2^256/ φ: ??? TiB Consecutive seeds: ??? TiB	
xoshiro256++	Jump-ahead by 2^64: ??? TiB Jump-ahead by 2^128: ??? TiB Jump-ahead by 2^256/ φ: ??? TiB Consecutive seeds: ???	

TiB

Jump-ahead by 2^64:

??? TiB

xoroshiro128\*\*

Jump-ahead by 2^128/

φ: ??? TiB

Consecutive seeds: ???

Jump-ahead by 2^64:

??? TiB

xoroshiro128++ Jump-ahead by 2^128/

φ: ??? TiB

Consecutive seeds: ???

Consecutive seeds: ???

TiB

PCG64

SFC64 Seed increment by

2^64: ??? TiB

Consecutive seeds: ???

TiB

Philox $4 \times 64$ -7 Seed increment by

2^64: ??? TiB

Jump-ahead by period/ What PCG calls "streams" does not produce φ: ??? TiB

independent sequences.

Jump-ahead by period/ ???

ω: ??? TiB

#### 0.2 Counter-Based PRNGs

Constructions for counter-based PRNGs (using the definition from (Salmon et al. 2011, section 2)(7) include:

- 1. A PRNG that outputs hash codes of a counter and the seed.
- 2. A PRNG that uses a block cipher with the seed as a key to output encrypted counters.

More specifically, let C and S each be 64 or greater and divisible by 8. Then:

- 1. A C-bit counter is set to 0 and an S-bit seed is chosen. In each iteration, the PRNG outputs H(seed || 0x5F || counter) (where H is a hash function, || means concatenation, 0x5F is the 8-bit block 0x5F, and seed and counter are little-endian encodings of the seed or counter, respectively), and adds 1 to the counter by wraparound addition. Or...
- 2. A C-bit counter is set to 0 and an S-bit seed is chosen. In each iteration, the PRNG outputs a block generated by a C-bit block cipher where the key is a little-endian encoding of the seed, and where the cleartext is a little-endian encoding of the counter, and adds 1 to the counter by wraparound addition.

The following lists hash functions and block ciphers that form high-quality counter-based PRNGs. It's possible that reduced-round versions of these and other functions will also produce high-quality counter-based PRNGs.

> **Fails** Function **PractRand** Notes Starting At

applies to regular sequence: 2, 4, Hash Functions: BEBB4185; BLAKE2S-256; BLAKE3; and 11 interleaved CityHash64; Falkhash; FarmHash128; FarmHash32; streams from FarmHash64; Farsh32; Farsh64; Floppsyhash; consecutive seeds; GoodOAAT; Half-SipHash; Hasshe2; MD5 (low 32 bits); 2, 4, and 11 Metrohash128; Mirhash; Mirhashstrict (low 32 bits); interleaved > 1 TiB MUM; MurmurHash64A for x64; MurmurHash3 (128streams from bit) for x64; Seahash; Seahash (low 32 bits); SHA-256; counters SHA-256 (low 64 bits); SHA3-256; SipHash; Spooky64; incremented by Fast Positive Hash (32-bit big-endian); TSip; xxHash v3 2<sup>64</sup>; 2, 4, and 11 64-bit (both full and low 32 bits) interleaved streams from counters incremented by  $2^{96}$ . ??? TiB (Consecutive ??? seeds: ??? TiB) ??? TiB (Consecutive ???

seeds: ??? TiB) ??? TiB (Consecutive

seeds: ??? TiB) S = 64, C = 128. Failure figure

#### 0.3 Combined PRNGs

???

The following lists high-quality combined PRNGs. See "<u>Testing PRNGs for High-Quality Randomness</u>" for more information on combining PRNGs.

Function	Fails PractRand Starting At Notes
??? combined with Weyl sequence	??? TiB
??? combined with 128-bit LCG	??? TiB
JSF64 combined with ???	??? TiB
JSF64 combined with ???	??? TiB
Tyche combined with ???	??? TiB
Tyche-i combined with ???	??? TiB
??? combined with ???	??? TiB

# 0.4 Splittable PRNGs

The following lists high-quality splittable PRNGs. See "<u>Testing PRNGs for High-Quality Randomness</u>" for more information on testing splittable PRNGs, and see the appendix for splittable PRNG constructions.

#### **Function Fails PractRand Starting At Notes**

??? ??? TiB ??? ??? TiB ??? TiB

## **0.5 PRNGs Not Preferred**

Although the following are technically high-quality PRNGs, they are not preferred:

PRNG	Notes
C++'s std::ranlux48	Usually takes about 192 8-bit bytes of memory. Admits up to 2^577 - 2 seeds; seed's bits cannot be all zeros or all ones
<u>engine</u>	(Lüscher 1994) <sup>(8)</sup> . The maximum cycle length for ranlux48's underlying generator is very close to 2^576.
A high-quality PRNG that is an LCG with	If the modulus is a power of 2, this PRNG can produce highly correlated "random" number sequences from seeds that differ
non-prime modulus	only in their high bits (see S. Vigna, "The wrap-up on PCG
(or a PRNG based on	<b>generators</b> ") and lowest bits have short cycles. What PCG calls
one, such as PCG)	"streams" does not produce independent sequences.

# **0.6 Not High-Quality PRNGs**

The following are not considered high-quality PRNGs:

Algorithm	Notes
Sequential counter	Doesn't behave like independent random sequence
A linear congruential generator with modulus less than $2^{63}$ (such as java.util.Random and C++'s std::minstd_rand and std::minstd_rand0 engines)	Admits fewer than $2^{63}$ seeds
Mersenne Twister (MT19937)	Shows a <b>systematic failure</b> in BigCrush's LinearComp test (part of L'Ecuyer and Simard's "TestU01"). (See also (Vigna 2019) <sup>(9)</sup> .) Moreover, it usually takes about 2500 8-bit bytes of memory.
Marsaglia's xorshift family ("Xorshift RNGs", 2003)	Shows systematic failures in SmallCrush's MatrixRank test (Vigna 2016) <sup>(10)</sup>
System.Random, as implemented in the .NET Framework 4.7	Admits fewer than $2^{63}$ seeds
Ran2 (Numerical Recipes)	Minimum cycle length less than $2^{63}$
msws (Widynski 2017) <sup>(11)</sup>	Admits fewer than $2^{63}$ seeds (about $2^{54.1}$ valid seeds)
JSF32 (B. Jenkins's "A small noncryptographic PRNG")	Admits fewer than $2^{63}$ seeds; proven minimum cycle length is only $2^{20}$ or more
JSF64 (B. Jenkins's "A small noncryptographic PRNG")	No proven minimum cycle of at least $2^{63}$ values
Middle square	No proven minimum cycle of at least $2^{63}$ values
Many cellular-automaton PRNGs	

(especially if they are neither reversible nor maximal-length<sup>(12)</sup>)
Tyche/Tyche-i (Neves and Araujo 2011)<sup>(13)</sup>
ISAAC ("ISAAC and RC4" by B. Jenkins)

No proven minimum cycle of at least  $2^{63}$  values

No proven minimum cycle of at least  $2^{63}$  values

Proven minimum cycle length is only  $2^{40}$  or more

### 1 Notes

- (1) Blackman, D., Vigna, S. "Scrambled Linear Pseudorandom Number Generators", 2019 (xoroshiro and xoshiro families); S. Vigna, "An experimental exploration of Marsaglia's xorshift generators, scrambled", 2016 (scrambled xorshift family).
- (2) L'Ecuyer, P., "Good Parameters and Implementations for Combined Multiple Recursive Random Number Generators", Operations Research 47(1), 1999; L'Ecuyer, P., Simard, R., et al., "An Object-Oriented Random Number Package with Many Long Streams and Substreams", Operations Research 50(6), 2002.
- (3) L'Ecuyer, P., Touzin, R., "Fast Combined Multiple Recursive Generators with Multipliers of the Form  $a = \pm 2^q \pm 2^{r_n}$ , Proceedings of the 2000 Winter Simulation Conference, 2000.
- (4) Jones, D., "Good Practice in (Pseudo) Random Number Generation for Bioinformatics Applications", 2007/2010.
- (5) P. L'Ecuyer, "Tables of Linear Congruential Generators of Different Sizes and Good Lattice Structure", *Mathematics of Computation* 68(225), January 1999, with <a href="mailto:errata">errata</a>.
- <sup>(6)</sup> This XorShift\* generator is not to be confused with S. Vigna's \*-scrambled PRNGs, which multiply the PRNG state differently than this one does.
- <sup>(7)</sup> Salmon, John K., Mark A. Moraes, Ron O. Dror, and David E. Shaw. "Parallel random numbers: as easy as 1, 2, 3." In *Proceedings of 2011 International Conference for High Performance Computing, Networking, Storage and Analysis*, pp. 1-12. 2011.
- (8) Lüscher, M., "A Portable High-Quality Random Number Generator for Lattice Field Theory Simulations", arXiv:hep-lat/9309020 (1994). See also Conrads, C., "Faster RANLUX Pseudo-Random Number Generators".
- (9) S. Vigna, "It Is High Time We Let Go of the Mersenne Twister", arXiv:1910.06437 [cs.DS], 2019.
- (10) S. Vigna, "An experimental exploration of Marsaglia's xorshift generators, scrambled", 2016.
- (11) Widynski, B., "Middle Square Weyl Sequence RNG", arXiv:1704.00358 [cs.CR], 2017.
- (12) Bhattacharjee, K., "Cellular Automata: Reversibility, Semi-reversibility and Randomness", arXiv:1911.03609 [cs.FL], 2019.
- (13) Neves, S., and Araujo, F., "Fast and Small Nonlinear Pseudorandom Number Generators for Computer Simulation", 2011.
- <sup>(14)</sup> Claessen, K, Pałka, M., "Splittable Pseudorandom Number Generators using Cryptographic Hashing", *ACM SIGPLAN Notices* 48(12), December 2013.

# 2 Appendix

## 2.1 Implementation Notes: Splittable PRNGs

Here are implementation notes on splittable PRNGs. The <u>pseudocode conventions</u> apply to this section. In addition, the following notation is used:

- The || symbol means concatenation.
- TOBYTES(x, n) converts an integer to a sequence of n 8-bit bytes, in "little-endian" encoding: the first byte is the 8 least significant bits, the second byte is the next 8 bits, and so on. No more than n times 8 bits are encoded, and unused bytes become

zeros.

- BLOCKLEN is the hash function's block size in bits. For noncryptographic hash functions, this can be the function's output size in bits instead. BLOCKLEN is rounded up to the closest multiple of 8.
- TOBLOCK(x) is the same as TOBYTES(x, BLOCKLEN / 8).

The splittable PRNG designs described here use *keyed hash functions*, which hash a message with a given key and output a hash code. An unkeyed hash function can become a keyed hash function by hashing the following data:  $key \mid \mid TOBYTES(0x5F, 1) \mid \mid message$ .

The Claessen-Pałka splittable PRNG (Claessen and Pałka 2013)<sup>(14)</sup> can be described as follows:

- A PRNG state has two components: a seed and a path (a vector of bits). A new state's seed is TOBLOCK(seed) and its path is an empty bit vector.
- split creates two new states from the old one; the first (or second) is a copy of the old state, except a 0 (or 1, respectively) is appended to the path. If a new state's path reaches BLOCKLEN bits this way, the state's seed is set to the result of hashing BitsToBytes(path) with the seed as the key, and the state's path is set to an empty bit vector.
- generate creates a random number by hashing BitsToBytes(path) with the seed as the key.

(The Claessen paper, section 5, also shows how a sequence of numbers can be generated from a state, essentially by hashing the path with the seed as the key, and in turn hashing a counter with that hash code as the key, but uses a rather complicated encoding to achieve this.)

The following helper method, in pseudocode, is used in the description above:

```
METHOD BitsToBytes(bits)

// Unfortunately, the Claessen paper sec. 3.3 pads

// blocks with zeros, creating a risk that different paths

// encode to the same byte sequence (e.g., <1100> vs.

// <11000> or <0011> vs. <00011>). Even without this padding,

// this risk exists unless the underlying hash function hashes

// bit sequences (not just byte sequences), which is rare.

// Therefore, encode the bits to a sequence of bytes

// rather than using the encoding given in sec. 3.3.

v = []
for i in 0...size(bits): v = v || TOBYTES(bits[i], 1)
return v

END METHOD
```

The splittable PRNG described in "JAX PRNG Design" can be described as follows:

- A PRNG state is generated from a seed with TOBLOCK(seed).
- split creates two new states from the old one; the first (or second) is a hash of TOBLOCK(0) (or TOBLOCK(1), respectively) with the old state as the key.
- generate creates one or more random numbers by hashing TOBLOCK(n) with the state as the key, where n starts at 1 and increases by 1 for each new random number.