# How 2 Random

Hank Chen

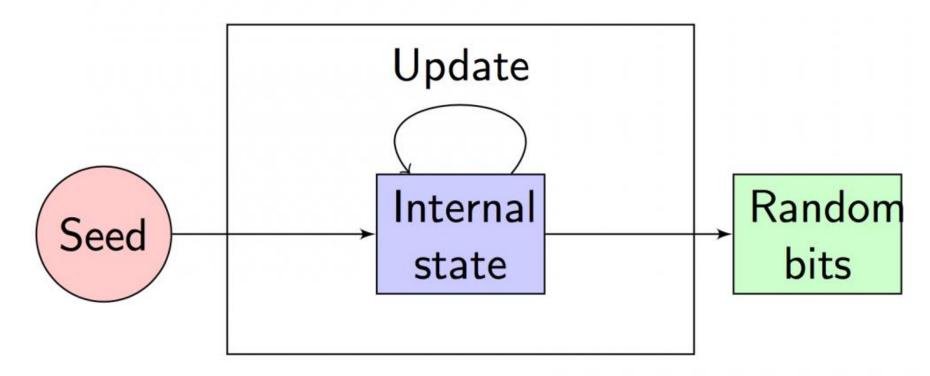
## Outline

- What Is PRNG?
- Is Random Enough?
- How 2 Random?

# What Is PRNG?

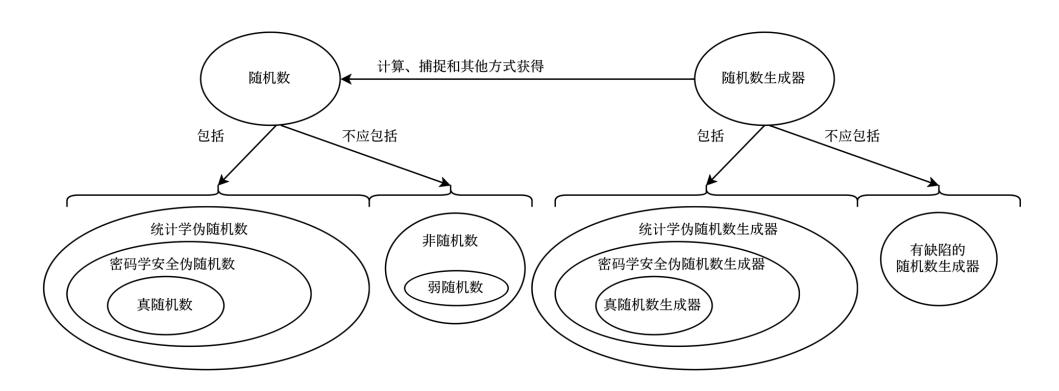
## PRNG (亂數產生器)

**Definition (fixed security parameter version):** A  $(t,\epsilon)$ -PRNG is a function



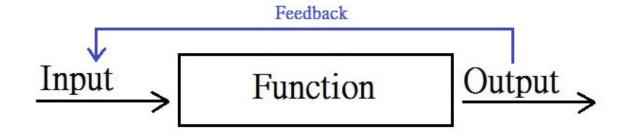
## Classification

- CSPRNG (Cryptographic Secure Pseudo Random Number Generator)
- TRNG (True Random Number Generator)



# CSPRNG (密碼學安全亂數產生器)

- One way function
  - 過去簡單,反推很難
  - Eg. Discrete Logrithm Problem
- Cipher based
  - CTR mode, IV = seed
  - Stream cipher, IV = seed
- Hash based
  - $x_{i+1} = x_i + 1$ ;  $o_{i+1} = H(x_i)$



# TRNG (真•亂數產生器)

- Definition
  - 不是電腦程式來生成亂數的裝置
  - eg. 石英共振、噪音
  - 用來生成PRNG的seed
- Product
  - TPM (Trusted Platform module)

## System Random

- Application (Linux)
  - /dev/urandom
  - /dev/random
  - system call getrandom()
    - /dev/random : 512 bytes
    - /dev/urandom : 33554431 bytes
  - /dev/hwrng

# Is Random Enough?

# Algorithm

- LCG
- XOR shift
- LFSR
- MT19937

# Linear congruential generator (LCG)

### 定義

 $\circ \quad x_{i+1} = ax_i + b \mod m$ 

#### 變形

- Raw:  $x_{i-1} = a^{-1} (x_i b) \mod m$
- 保留 Low order bits: 估上下界
- 保留 High order bits:LLL reduction

# Lab1 — Crack LCG

## Crack LCG

```
class prng_lcg:
   m = 672257317069504227 # the "multiplier"
   c = 7382843889490547368 # the "increment"
   n = 9223372036854775783 # the "modulus"
   def __init__(self, seed):
        self.state = seed # the "seed"
    def next(self):
        self.state = (self.state * self.m + self.c) % self.n
       return self.state
def test():
   gen = prng_lcg(123) # seed = 123
   print gen.next() # generate first value
    print gen.next() # generate second value
    print gen.next() # generate third value
```

### Crack LCG – Level 1

Everything Known

```
m = 672257317069504227  # the "multiplier"
c = 7382843889490547368  # the "increment"
n = 9223372036854775783  # the "modulus"
s0 = 2300417199649672133  # seed
```

```
In [931]: s1 = (s0*m + c) % n
In [931]: s2 = (s1*m + c) % n
In [932]: s3 = (s2*m + c) % n
In [933]: s4 = (s3*m + c) % n
In [934]: s1
Out[934]: 2071270403368304644L # correct
In [935]: s2
Out[935]: 5907618127072939765L # correct
In [936]: s3
Out[936]: 5457707446309988294L # predicted!
```

## Crack LCG — Level 2

s1 = (s0\*m + c) % n

Unknown increment

```
m = 81853448938945944
c = # unknown
n = 9223372036854775783
```

```
s0 = 4501678582054734753
s1 = 4371244338968431602
```

$$s1 = s0*m + c \pmod{n}$$
  
 $c = s1 - s0*m \pmod{n}$ 

### Crack LCG – Level 3

```
s1 = (s0*m + c) % n
```

unknown increment and multiplier

```
m = # unknown
c = # unknown
n = 9223372036854775783
```

```
s0 = 6473702802409947663
s1 = 6562621845583276653
s2 = 4483807506768649573
```

```
s_1 = s0*m + c (mod n)
s_2 = s1*m + c (mod n)

s_2 - s_1 = s1*m - s0*m (mod n)
s_2 - s_1 = m*(s1 - s0) (mod n)
m = (s_2 - s_1)/(s_1 - s_0) (mod n)
```

## Crack LCG – Level 4

nc 140.114.77.172 60001



```
t0 = s1 - s0

t1 = s2 - s1 = (s1*m + c) - (s0*m + c) = m*(s1 - s0) = m*t0 (mod n)

t2 = s3 - s2 = (s2*m + c) - (s1*m + c) = m*(s2 - s1) = m*t1 (mod n)

t3 = s4 - s3 = (s3*m + c) - (s2*m + c) = m*(s3 - s2) = m*t2 (mod n)

t2*t0 - t1*t1 = (m*m*t0 * t0) - (m*t0 * m*t0) = 0 (mod n)
```

```
class prng lcg:
    m = 18915395381570599495367979136204155731148014490342576
    c = 43673988490893595960713628732896022279027189637865181
    n = 95261208187898118531884929355668872111152375852661303
    def __init__(self, seed):
        self.state = seed # the "seed"
    def next(self):
        self.state = (self.state * self.m + self.c) % self.n
        return self.state
def start():
    seed = bytes_to_long(os.urandom(32))
    gen = prng lcg(seed)
    for i in range(10):
        rand = gen.next()
        print("Next: ", rand)
    try:
        rand = gen.next()
        num = int(input("[>] Give me a number: "))
        if num == rand:
            print("Congratulation!!")
        else:
            print("Oops!")
        exit(0)
    except ValueError:
        print("Not integer!!")
        exit(1)
start()
```

## **XORShift**

運算速度快,程式碼簡單

#### 定義

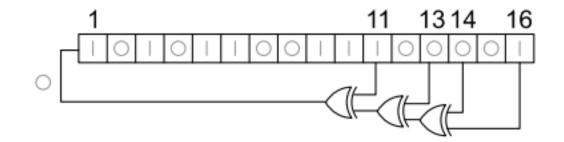
$$\circ$$
  $x \oplus = (x \ll a); x \oplus = (x \gg b); x \oplus = (x \ll c);$ 

#### 分析技巧

 $\circ$  把 x 看成 bit vector,XOR 和 Shift 可以寫成 GF(2) 下的矩陣乘法

## **LFSR**

- 暫存器的初始值是 seed
- 一次輸出一個 bit
  - 輸出的 bit 會變成第一個暫存器的值



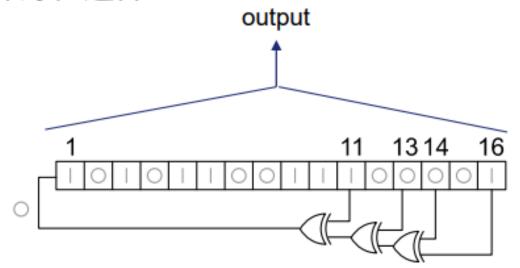
- 分析技巧
  - 跟 XORShift 一樣用 bit vector 和 GF(2) 矩陣來處裡

## Filtered LFSR

從輸出第一個暫存器改成對整個state做非線性運算

$$\circ \quad s_{i+1} = LFSR(s_i); \quad o = f(s_{i+1})$$

- 分析方法
  - 找 f 的 線性 (或low degree) annihilator g
    - $\forall x : f(x) = 1, g(x) = 0$
  - o 對於所有  $f(s_i) = 1$  的地方用  $g(s_i)$  建聯立方程式並求解



## Mersenne Twister (MT19937)

- 週期長、沒專利、通過很多測試…
- 許多語言的預設算法:MATLAB, PHP, Python, R, Ruby, Octave …
- 狀態為624個32-bits的數字
- $x_i$  由  $x_{i-624}$ ,  $x_{i-623}$ ,  $x_{i-227}$  三個數字運算而成
- 輸出前會先經過一個可逆的非線性函數
  - 可以由連續 624 個 32bits 的輸出還原出狀態
  - 可以由足夠多獨立的 bits 解方程式還原出狀態

# Lab2 — Crack MT19937

## Crack MT19937

```
class MT19937:
    def __init__(self, seed):
        self.mt = [0] * 624
       self.mt[0] = seed
       self.mti = 0
        for i in range(1, 624):
            self.mt[i] = int32(1812433253 * (self.mt[i - 1] ^ self.mt[i - 1] >> 30) + i)
    def extract_number(self):
        if self.mti == 0:
            self.twist()
       y = self.mt[self.mti]
       y = y ^ y >> 11
       y = y ^ y << 7 & 2636928640
       y = y ^ y << 15 & 4022730752
       y = y ^ y >> 18
       self.mti = (self.mti + 1) % 624
       return _int32(y)
    def twist(self):
        for i in range(0, 624):
            y = int32((self.mt[i] \& 0x80000000) + (self.mt[(i + 1) % 624] \& 0x7ffffffff))
            self.mt[i] = (y >> 1) ^ self.mt[(i + 397) % 624]
            if y % 2 != 0:
                self.mt[i] = self.mt[i] ^ 0x9908b0df
```

### https://github.com/python/cpython/blob/master/Lib/random.py

```
# Non-unit step argument supplied.
def randrange(self, start, stop=None, step=1, _int=int):
                                                                             istep = _int(step)
   """Choose a random item from range(start, stop[, step]).
                                                                             if istep != step:
                                                                                 raise ValueError("non-integer step for randrange()")
                                                                             if istep > 0:
   This fixes the problem with randint() which includes the
                                                                                n = (width + istep - 1) // istep
   endpoint; in Python this is usually not what you want.
                                                                             elif istep < 0:
                                                                                 n = (width + istep + 1) // istep
    0.00
                                                                             else:
                                                                                 raise ValueError("zero step for randrange()")
   # This code is a bit messy to make it fast for the
   # common case while still doing adequate error checking.
                                                                             if n <= 0:
   istart = _int(start)
                                                                                 raise ValueError("empty range for randrange()")
    if istart != start:
       raise ValueError("non-integer arg 1 for randrange()")
                                                                             return istart + istep*self. randbelow(n)
   if stop is None:
       if istart > 0:
                                                                        def randbelow with getrandbits(self, n):
           return self. randbelow(istart)
                                                                            "Return a random int in the range [0,n). Raises ValueError if n==0."
       raise ValueError("empty range for randrange()")
   # stop argument supplied.
                                                                            getrandbits = self.getrandbits
   istop = _int(stop)
                                                                            k = n.bit length() # don't use (n-1) here because n can be 1
   if istop != stop:
                                                                            r = getrandbits(k)
                                                                                                          # 0 <= r < 2**k
       raise ValueError("non-integer stop for randrange()")
                                                                            while r >= n:
   width = istop - istart
   if step == 1 and width > 0:
                                                                                 r = getrandbits(k)
       return istart + self. randbelow(width)
                                                                            return r
   if step == 1:
       raise ValueError("empty range for randrange() (%d, %d, %d)" % (istart, istop, width))
```

## Crack MT19937 – Level 1

- nc 140.114.77.172 60002
- Choose 2 or 3 numbers from 624 "continuous" random number
- Each number in range(0, 4294967295)

```
def start():
    random.seed(os.urandom(32))
    num_list = []
    for i in range(624):
        #rand = random.randrange(4294967295)
        rand = random.getrandbits(32)
        num_list.append(rand)
    try:
        print("Oh! Great one who summons me, I stand by my oath: loyalty
        first = int(input("[>] Give me the first index: "))
        print("[>] Here is the first number: %d" % num_list[first])
        sys.stdout.flush()
        second = int(input("[>] Give me the second index: "))
        print("[>] Here is the second number: %d" % num list[second])
        sys.stdout.flush()
        third = int(input("[>] Give me the third index: "))
        if num list[third] < 10000000000:</pre>
            print("[>] Here is the third number: %d" % num list[third])
        else:
            print("[>] You see, a genie without a master, goes back in '
        sys.stdout.flush()
        guess = int(input("[>] There is no wish for predict random: "))
        next = random.getrandbits(32)
        if guess == next:
            print("[>] As you wish, Master!! Here is flag")
            print(flag)
        else:
            print("[>] You seek glory for yourself. And you would win i
        exit(0)
    except:
        print("[>] Couple thousand years in a Cave of Wonders ought to
        exit(1)
start()
```

## Crack MT19937 – Level 2

- 2019 BalsnCTF unpredictable
  - Filter out 25% number
  - Use the relationship between  $X_{i+1}$ ,  $X_{i+397}$ ,  $X_{i+624}$
  - Construct tree structure to verify the index
  - Reduce to the shortest path problem
- How much filter ratio is probably noninvertible?

```
import sys
import os
import hashlib
import random
version = sys.version.replace('\n', ' ')
print(f'Python {version}')
random.seed(os.urandom(1337))
for i in range(0x1337):
    print(random.randrange(3133731337))
# Encrypt flag
sha512 = hashlib.sha512()
for in range(1000):
    rnd = random.getrandbits(32)
    sha512.update(str(rnd).encode('ascii'))
key = sha512.digest()
with open('../flag.txt', 'rb') as f:
    flag = f.read()
enc = bytes(a ^ b for a, b in zip(flag, key))
print('Encrypted:', enc.hex())
```

# Cryptographic Backdoor

## Trapdoor V.S. Backdoor

- Trapdoor
  - One way function
  - 不知道密鑰的人要算很久
- Backdoor
  - 定義:
    - A feature or defect that allows surreptitious access to data
  - 特色:
    - NOBUS (No One But Us)
    - Deniable
    - Reusable (optional)
    - Unmalleable (hard to replicate)
    - Forward-secure (previous exploits aren't compromised)

## Why random number is important?

- Most of Cryptosystems need random number
  - RSA: p,q
  - AES: iv, key
  - DSA: private key
  - ECC: points on curve
- If we enable to predict PRNG
  - We know everything!!!



### **NSA**

#### 美國國家安全局 🕮

维基百科,自由的百科全書

■「NSA」重新導向至此。關於5G通信技術中的非獨立組網模式,詳見「5G NR」。

美國國家安全局(英語: National Security Agency, 縮寫: NSA)是美國政府機構中最大的情報部門,專門負責收集和分析外國及本國通訊資料,隸屬於美國國防部,是根據美國總統的命令成立的部門。

#### 目錄 [隱藏]

- 1 簡介
- 2 歷史
- 3 工作
- 4 電話與網路監聽
- 5 參考文獻
- 6 外部連結
- 7 參見

#### 簡介[編輯]

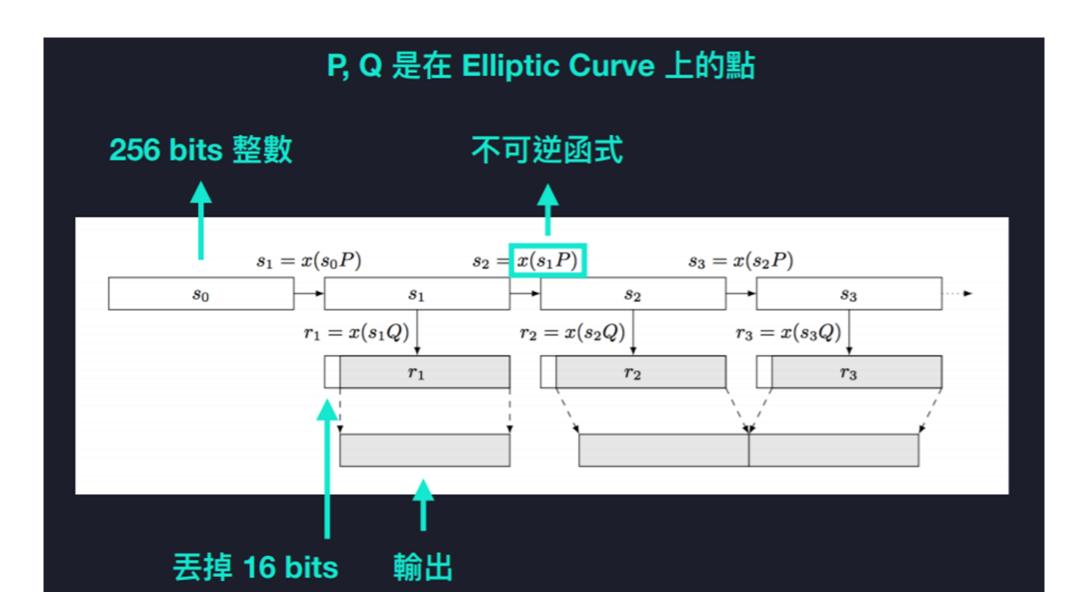
美國國家安全局(亦可譯為國家安全總署)負責監聽的包括電台廣播、通訊、網際網路,尤其是軍事和外交的秘密通訊,掌握比美國中央情報局遭要多的經費<sup>來源請求]</sup>,是世界上單獨僱傭最多數學博士和電腦專家的單位,直到最近,甚至不為美國政府的其他部門所了解,所以它的縮寫NSA經常被戲稱為「No Such Agency」(無此單位)。

美國國家安全局繼承了第二次世界大戰中成功破譯敵方密碼的工作(美國軍情八處)。

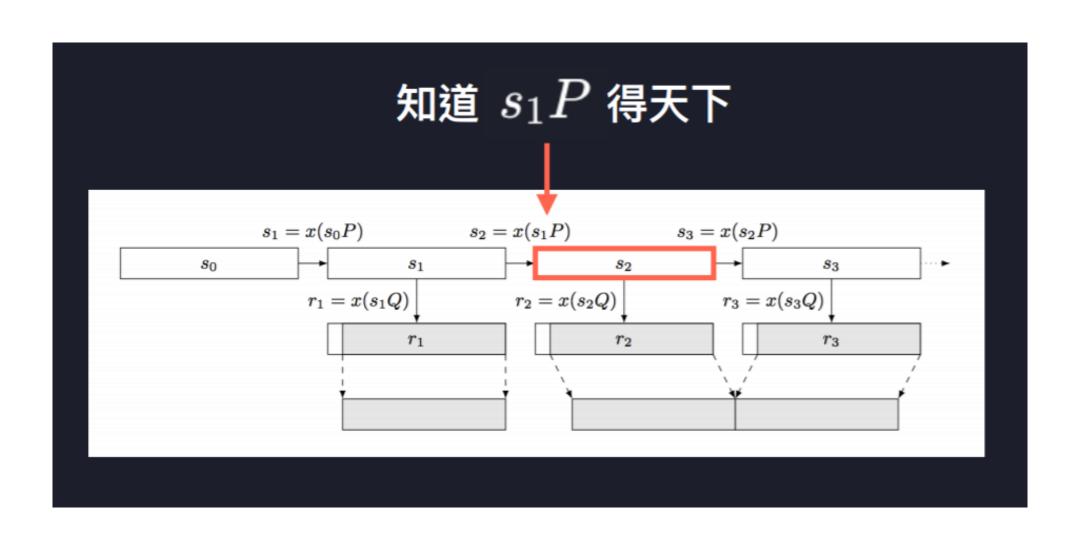
美國國家安全局位於馬里蘭州,在華盛頓特區東北16公里的米德堡,在巴爾的摩至華府的高速公路上有自己單獨的出口匝道,「NSA屋員專用」的標誌,平時有兩輛馬里蘭州警車守衛,總部每年的用電費用超過2千1百萬美元,門前有18,000個停車位。(一般慣例是為來說者保留一半的停車位)。



## NSA – EC DRBG



## https://blog.0xbadc0de.be/archives/155



### 2013

# Snowden leaks - Project BULLRUN 驗證後門真的存在

#### TOP SECRET//SI//REL TO USA, FVEY

CLASSIFICATION GUIDE TITLE/NUMBER: (U//FOUO) PROJECT

BULLRUN/2-16

PUBLICATION DATE: 16 June 2010

OFFICE OF ORIGIN: (U) Cryptanalysis and Exploitation Services

POC: (U) Cryptanalysis and Exploitation Services (CES) Classification

Advisory Officer

PHONE:

#### ORIGINAL CLASSIFICATION AUTHORITY:

 (TS//SI//REL) Project BULLRUN deals with NSA's abilities to defeat the encryption used in specific network communication technologies. BULLRUN involves multiple

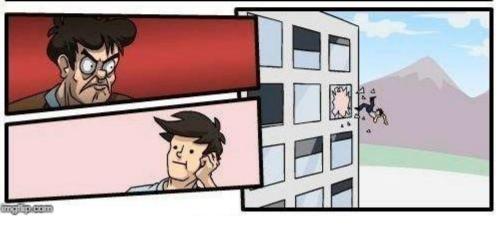
# How 2 Random?

## The Correct Way

- Understand algorithms of PRNG
- Change your seed periodically
- Make sure your seed is from hardware
- Also make sure you have enough entropy







## Reference

- https://oalieno.github.io/security/crypto/classic/dual-ec/
- Sasdf slides from NCTU CTF



Thanks for Your Listening!