

# Generation of True Random Numbers using quasi-Monte Carlo methods

Ana I Gomez, Domingo Gómez-Pérez, Florian Pausinger

Universidad de Cantabria, Queen's University Belfast

MCQMC 2018

TRNGs use physical processes to generate random numbers. Some characteristics

- Underlying physical process must be not possible to control
- Principle used to extract entropy and physical phenomenon limits the bit rate

Randomness source available from hardware accelerators (FPGAs, CPDs, ASICs).

Application to embedded security systems (cryptographic system-on-chip).  
Methodology AIS 31

## Challenges in modern embedded TRNG design

- i Finding a good quality source of randomness available in the digital technology
- ii Finding an efficient and robust principle of randomness extraction
- iii Guaranteeing the security (e.g. by a robust design or by an efficient online testing).

Mathematical assessment of the security: Lower bound of entropy per output bit

$$H(X) = -p \cdot \log_2(p) - (1 - p) \cdot \log_2(p),$$

where  $X$  is a random variable and  $p$ , bit probability

- Designs based on a stochastic model of the random process.
- If minimal entropy per output bit approaches 1, then the TRNG is an ideal RNG.

TRNG design by Cherkaoui et al. [1] that exploits the jitter noise of events propagating in a self-timed ring

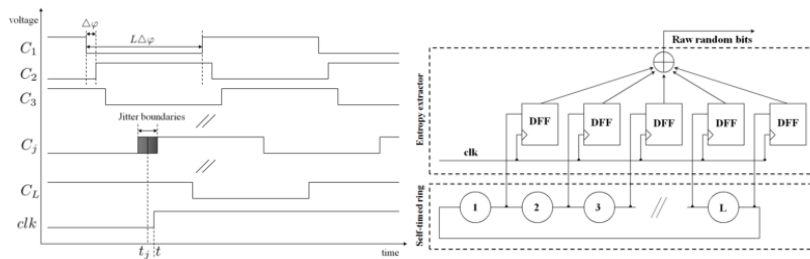
- Self-timed rings are oscillators in which several events can evolve evenly-spaced in time.
- Jitter noise make the significant instants of a digital signal vary from their ideal position in time.

The distance between two events is given by the phase difference

$$\Delta\phi = \frac{T}{2L}$$

where  $T$ , oscillation period.  $L$ , number of stages of the design.

# TRNG Design



# stochastic model

$\{C_i\}_{i=0}^{L-1}$ : STR output signals, ordered by its mean time arrival  $t_i$

$\{X_i\}_{i=0}^{L-1}$ : random variable represents time position of each event,

probability distribution  $N(t_i, \sigma^2)$

For a sampling time  $t$ , if  $\sigma < \Delta\phi$

$$P[X_j < t] = \Phi\left(\frac{t - t_j}{\sigma}\right), P[X_{j-1} < t] = \Phi\left(\frac{t - t_j - \Delta\phi}{\sigma}\right)$$

Then, the probability that the output bit value at time  $t$  is equal to  $u$  is the probability of the XOR of the previous value

$$P_u(t) = 1 - \Phi\left(\frac{t - t_j}{\sigma}\right) - \Phi\left(\frac{t - t_j - \Delta\phi}{\sigma}\right) \\ + 2\Phi\left(\frac{t - t_j}{\sigma}\right)\Phi\left(\frac{t - t_j - \Delta\phi}{\sigma}\right)$$

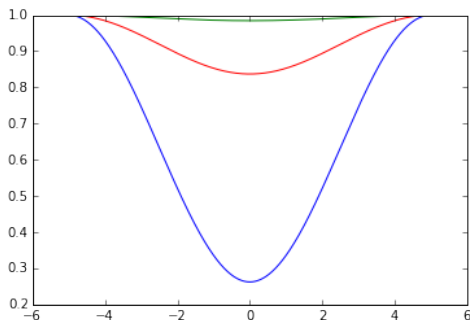


Figure:  $H$  versus  $t$ .  $\sigma = \Delta\phi/4$  (Blue line),  $\sigma = \Delta\phi/2$  (red line), corresponds to  $\sigma = \Delta\phi$  (green line)



Non deterministic sampling time (jitter noise),  $t$  is the realization of a random variable  $Z \sim N(t_s, \sigma_{\text{clk}}^2)$

$$P[X_j < Z] = \int_{-\infty}^{\infty} \Phi\left(\frac{t' - t_j}{\sigma}\right) \cdot f_z\left(\frac{t' - t}{\sigma_{\text{clk}}}\right) dt'$$

$$P[X_{j-1} < Z] = \int_{-\infty}^{\infty} \Phi\left(\frac{t' - t_j - \Delta\phi}{\sigma}\right) \cdot f_z\left(\frac{t' - t}{\sigma_{\text{clk}}}\right) dt'$$

$$P_u(t) = 1 - P[X_j < Z] - P[X_{j-1} < Z] + 2 \cdot P[X_{j-1} < Z] P[X_j < Z]$$

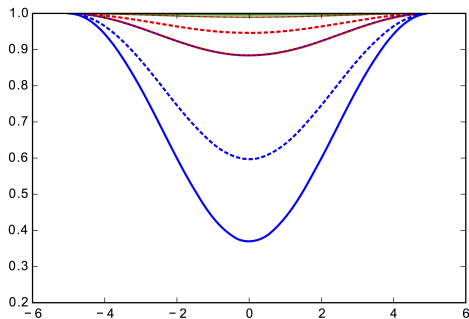


Figure:  $H$  versus  $t$ .  $\sigma = \Delta\phi/4$  (Blue line),  $\sigma = \Delta\phi/2$  (red line), corresponds to  $\sigma = \Delta\phi$  (green line). Continuous line corresponds to  $\sigma_{clk} = \sigma/2$ , segmented line to  $\sigma_{clk} = \sigma$ , and dotted line corresponds to  $\sigma_{clk} = 2\sigma$

Minimum entropy when  $n$  successive input bits are combined into one output bit for

- Random sampling points

Example:  $\sigma = \frac{\Delta\phi}{4}$ ,  $H \sim 1$  after 40 bits

- Uniform distributed sampling points

Example:  $\sigma = \frac{\Delta\phi}{4}$ ,  $H \sim 1$  after 20 bits when  $f_{clock} = \frac{36}{125} \Delta\phi$

Finding an optimal set of sampling points, regarding:

- Optimal parameters for the underlying digital design
- Several STR with different frequencies



CHERKAOUI, A., FISCHER, V., AUBERT, A., & FRESQUET, L. *A Self-timed Ring Based True Random Number Generator*. In International symposium on advanced research in asynchronous circuits and systems- ASYNC 2013. (99–106), 2013.



CHERKAOUI, A., FISCHER, V., AUBERT, A., & FRESQUET, L. *A Very High Speed True Random Number Generator with Entropy Assesment*. In Cryptographic Hardware and Embedded Systems. CHES 2013. (179–196), 2013.

Thanks for your attention!