

Implementation details of Hilbert sampling

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Abstract

This program contains the implementation of the Hilbert sampling developed in [He and Owen \(2014\)](#). To drive the Hilbert sampling, we need two ingredients: one-dimensional randomized quasi-Monte Carlo (RQMC) inputs and Hilbert’s curve. We use scrambled van der Courput (VDC) sequences as the QMC inputs. Also, we use Butz’ algorithm (see [Butz, 1971](#)) to approximate the Hilbert’s curve with a desired precision.

1 Hilbert generator

The class *HilberSampling* is the core contribution of this work, which is based on the source code in [Lawder \(2000\)](#). One of the constructors in *HilberSampling* is given as

$$\text{HilbertGenerator}(m, d),$$

where m is the order of the Hilbert’s curve, namely $H_m(x)$, and d is the dimension. Another constructor used to drive the fast algorithm is given as

$$\text{HilbertGenerator}(m, m', d),$$

where m' is the order of the Hilbert’ curve to be reserved and $m' \leq m$. The main functions

$$\text{convert}(P, x) \text{ and } \text{fastConvert}(P, x)$$

are actually the random mapping function $P = H_m(x) + \mathbf{u}$, where $x \in [0, 1]$ is one of the scrambled VDC points, $\mathbf{u} \sim \mathbb{U}([0, 2^{-m}]^d)$, and $H_m(x)$ represents the first m bits of $H(x)$. The later one uses the stored bits of $H_{m'}$ to speed

up the algorithm. If the first m' bits were stored, the *fastConvert* function only needs to compute the later $m - m'$ bits by the Butz' algorithm. In such way, a lot of computation can be saved. Otherwise, the function will store the m' bits of $H_{m'}$ and the necessary ingredients which are used to generate the next bit. The total storage is $O(d2^{m'})$.

If the sample size is $n = 2^K$, then we set $m = \lceil K/d \rceil$ and $m' = \lfloor K/d \rfloor$. Note that this program is only implemented for $1 \leq d \leq 31$ and $0 < m' \leq m \leq 31$. If $m' = 0$, the *fastConvert* function will be redirected to the *convert* function.

2 RQMC generator

To make comparisons with RQMC, we generate scrambled Sobol' points (see Sobol', 1967) by using the C++ library of T. Kollig and A. Keller (<http://www.uni-kl.de/AG-Heinrich/SamplePack.html>). Also, we use the first dimension of scrambled Sobol' sequence as the scrambled VDC sequence. We use *drand48()* as the pseudo-random numbers generator. One can replace it with other generator in the header file *Drand48.h*.

References

- Butz, A. R. (1971). Alternative algorithm for Hilbert's space-filling curve. *IEEE Transactions on Computers*, 20(4):424–426.
- He, Z. and Owen, A. B. (2014). Extensible grids: uniform sampling on a space-filling curve. *arXiv preprint arXiv:1406.4549*.
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