BECOS

Predictive Engineering and Computational Sciences

THE QUESO LIBRARY FOR UNCERTAINTY QUANTIFICATION IN LARGE-SCALE MODELS



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Introduction

- The QUESO library is a collection of parallel statistical algorithms and object-oriented programming constructs supporting research into the uncertainty quantification of mathematical models.
- Quantification of Uncertainty for Estimation, Simulation and Optimization
- Available at https://github.com/libqueso/queso
- Development began in 2008 under the PSAAP program
- Since 2011, QUESO development has been part of the SCIDac3 program as part of the QUEST center
- QUESO is used by Dakota to solve the inverse problem
- QUESO has traditionally focused on the inverse problem but has forward propagation capabilities as well





Recent Changes in QUESO

• New swanky website: http://libqueso.com • Version 0.51.0 Add canned likelihood for scalar GPMSA use-case a la Higdon et al Add a logit-transformed transition kernel for more efficient proposals Adding Jeffreys distribution as an available prior distribution • Adding likelihood value caching to ML sampler • Version 0.52.0 Add canned Gaussian likelihoods for different full/diagonal/scalar/block diagonal covariance matrices • Above: 428 commits • DAKOTA integration. Ongoing work with Laura Swiler, Brian Adams, Mike Eldred, Brian Williams • Version 0.53.0 Add linear interpolation surrogates Refactor input options processing Refactor existing queso errors and asserts Add new error checking macros • Add basic scoped pointer wrappers • Better error message reporting for bad sample covariance matrices



Parallel Chains in QUESO

Why use QUESO?

Other solutions available: R, PyMC, emcee, MICA, etc
QUESO solves the same problem but has significantly more CS&E capabilities
Has been designed to be used with large forward problems
Has been used with over 10k cores
Support for finite and infinite dimensional problems
Can sample multimodal distributions
Can leverage Dakota for forward propagation (Dakota can use QUESO for the inverse problem)
Emulation capabilities being developed

Feature highlight: multilevel sampling



Infinite dimensional enables sampling of functions





 $l = 0, 1, \dots, L \ge 1, \qquad \pi_{\mathsf{target}}^{(l)}(\boldsymbol{\theta}) = f^{\tau_l}(D|\boldsymbol{\theta}) \times \pi_{\mathsf{prior}}(\boldsymbol{\theta}), \qquad 0 = \tau_0 < \tau_1 < \dots < \tau_{L-1} < \tau_L = 1.$



Top left: UQ on single parameter. Top right: UQ on several parameters. Bottom: UQ on functions.

QUEST Impact on QUESO

• PAST

Documentation and testing
Trilinos integration

Dakota integration

• New example problems

• PRESENT

GPMSA

More Dakota integration

Software quality and usability improvements

• User community development

• Infinite dimensional UQ

• FUTURE

Further emulation development

Continued software engineering improvement

Additional options for vector/matrix classes to increase user base

• Opportunity to be adopted as THE community code for uncertainty quantification

HPC RelevanceParallel Sampling

Batch Job Begin, N_f = 0

Increased Sample Acceptance Rate via Logit Transformation

Performance improvement with $\text{logit}(x) = \log(1/(1-x))$ This maps $(0,1) \rightarrow (-\infty,\infty)$. We never propose states out of bounds:



Automatic load-balancing for homogenous systems
Future load-balancing for heterogeneous systems
Fault tolerance

Sponsors

2008 – 2014: DOE NNSA, PSAAP Program
2010 – 2011: DOE SNL-NM, Peridynamics Program
2010 – 2012: KAUST, AEA2 Program
2011 – 2013: AFOSR, RTC, DDDAS Program
2011 – 2015: DOE SC, SciDAC3 Program
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E. E. Prudencio and K. W. Schulz. The parallel C++ statistical library QUESO: Quantification of Uncertainty for Estimation, Simulation and Optimization. In M. Alexander et al., editors, Euro-Par 2011 Workshops, Part I, volume 7155 of Lecture Notes in Computer Science, pages 398-407. Springer-Verlag, Berlin Heidelberg, 2012.

QUESO featured in the Springer UQ Handbook

QUESO chapter co-authored with Damon McDougall, Nicholas Malaya and Robert Moser
Formulates the types of problems QUESO can solve
Example for showcasing how the user interacts with the API in general
Showcases a specific exmple (ball-drop problem)
Showcases an infinite-dimensional UQ example
Showcases extensiblity through custom priors (for, perhaps, hierarchical Bayesian problems)
Extended documentation effort!

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