Bayesian Analysis Users Guide
Release 4.00, Manual Version 1

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Test Your Own ASCII Model

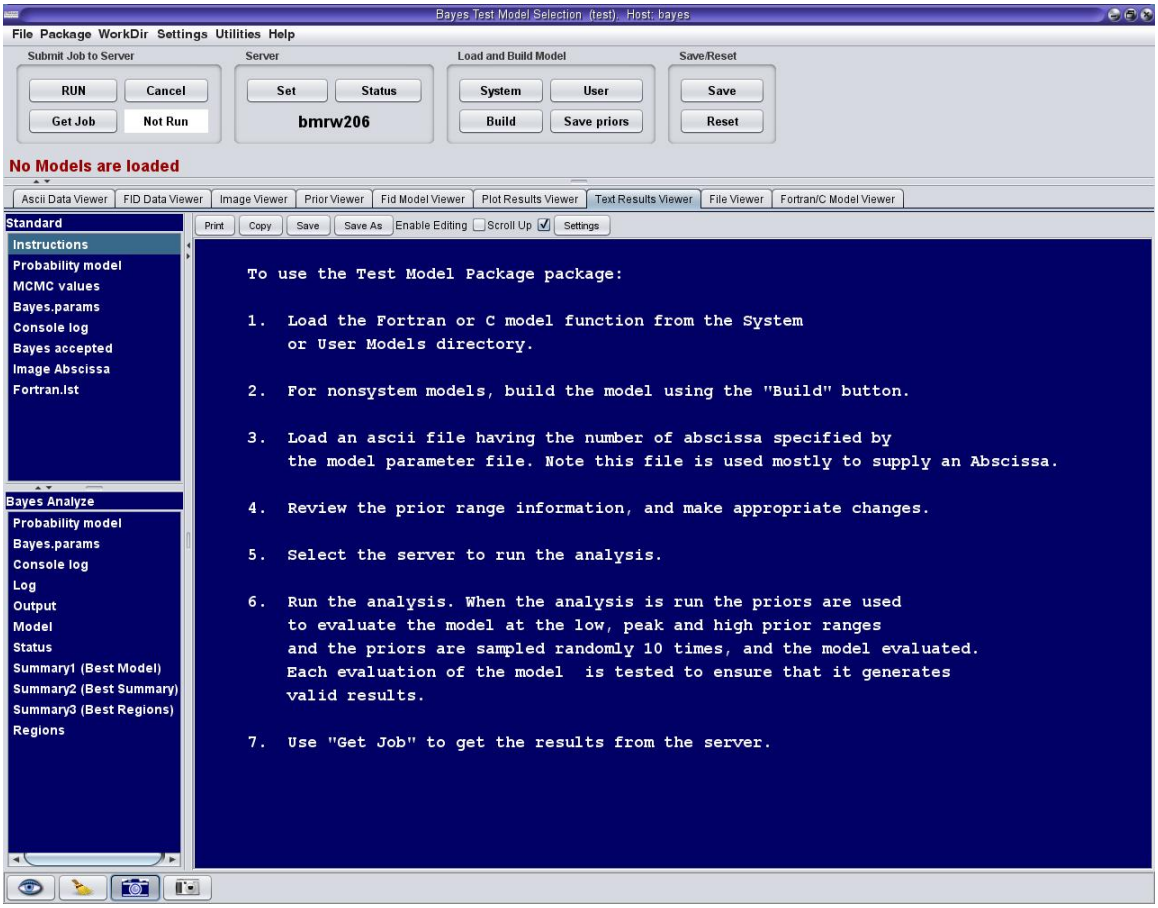

Figure 21.1: This is the interface to a package that lets you test your Ascii models. Sometimes, after building an Ascii model it will fail and tracking down the problem is very difficult because the models are not run on your local machine. This package attempts to help with testing Ascii Models. After loading a model and some data, this package will do everything it can to make the model malfunction. For more on the actual calculations and the widgets see the text.

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