

## 1 Making BUGS Open

BUGS is a long running software project aiming to make modern MCMC techniques based on graphical models available to applied statisticians in an easy to use package. This talk will give an overview of the structure of OpenBUGS the open source version of the BUGS software and the tools used in its creation and maintenance. Interfacing BUGS to R will also be discussed in particular the possibilities for closer coupling than currently available in the BRugs package.

## 2 Adopt a module

Unique once in a life time opportunity. You can choose which OpenBUGS module you would like to care for. Adopt a module and you can take a precious piece of software home with you to read and play with! Hundreds of modules to choose from but many thousands of BUGS users. Hurry while stocks last!

## 3 Happy modules

Would an OpenBUGS module be happy with you? Some questions to ask yourself: what is a module? what is a class? what is an object? what is a factory object? what is an interface? what is the difference between client and extension interfaces? why are concrete classes hidden? what is metaprogramming? what do I do with blue diamonds? why are trap messages helpful? what is the Hollywood principle of programming? can I program in C?

## 4 Myth I

**BUGS is one big scary monster**

**Reality**

**BUGS is lots of friendly little bits**

**5 Myth II**

**BUGS is written in a strange complicated language**

**Reality**

**Component Pascal is a very simple powerful language**

**6 Myth III**

**BUGS uses strange development tools**

**Reality**

**BlackBox tools are very simple to use (they are also free...)**

**7 Myth IV**

**Open source software must be developed in C/C++ using GNU tools**

**Reality**

**Open source software must be developed in C/C++ using GNU tools**

**8 Myth V**

**Software technology has not changed in the past 20 years**

**Reality**

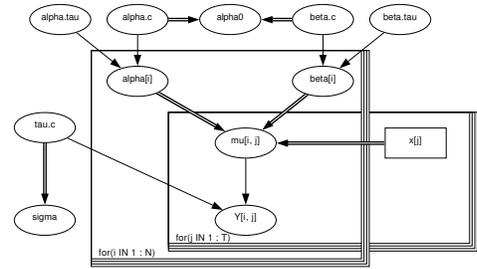
**There is Microsoft, there is Linux, there is the Intel based PC (and the Mac...)**

## 9 How BUGS works

Create lots of objects, wire them together and then get the objects to talk to each other.

Need a plan of how to do this

## 10 The plan



## 11 Bayesian graphical models

The type of plan BUGS understands is called a bayesian graphical model.

Bayesian graphical models describe conditional independence assumptions

Give factorization of joint probability distribution

## 12 Graphs as (formal) language

```
model
{
  for( i in 1 : N ){
    for( j in 1 : T ){
      Y[i, j] ~ dnorm(mu[i, j], tau.c)
      mu[i, j] <- alpha[i] + beta[i] * (x[j] - xbar)
    }
    alpha[i] ~ dnorm(alpha.c, alpha.tau)
    beta[i] ~ dnorm(beta.c, beta.tau)
  }
  tau.c ~ dgamma(0.001, 0.001)
  sigma <- 1 / sqrt(tau.c)
  alpha.c ~ dnorm(0.0, 1.0E-6)
  alpha.tau ~ dgamma(0.001, 0.001)
  beta.c ~ dnorm(0.0, 1.0E-6)
```

### 13 Compilation

Turning description in one language into equivalent description in another language

Can add extra information

New description can be executable

### 14 An analogy

Science program written in fortran

Compiled to assembly language

Assembly language - low level instruction that cause the CPU to do things

### 15 An analogy continued

Statistical model written as a graph

Compiled into inference algorithm

Inference algorithm executed

### 16 Inference algorithms

Many possibilities

Want good natured algorithm not fussy about what it is asked to do.

MCMC simulation good choice

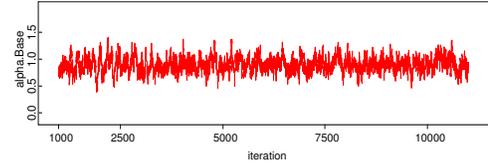
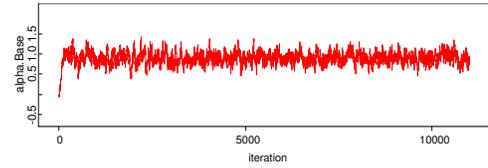
## 17 MCMC simulation

Generate lots of random numbers

After a bit calculate averages of these random numbers

Also can calculate quartiles, kernel densities etc.

## 18 MCMC simulation continued



	mean	sd	MC_error	val2.5pc	median	val97.5pc	start	sample
alpha.Base	0.8934	0.1388	0.006738	0.6265	0.8891	1.173	1001	10000

## 19 The BUGS software

BUGS has to do lots of tasks.

This does not make BUGS one big scary monster.

BUGS contains subsystems to perform specific tasks

Each subsystem consists of a number of modules

Each module is small and easy to understand

## 20 Tasks and subsystems

**Describing graphical models**  
Doodle subsystem

**Compiling graphical model**  
Bugs subsystem

**Probability calculations**  
Graph subsystem

**MCMC simulation**  
Updater subsystem

**Summary statistics**  
Samples, Summary, Ranks,  
Deviance subsystems

## 21 Subsystems and modules I

**Subsystems can consist of a small number of modules or a large number**

**Samples subsystem is small**

SamplesMonitors SamplesIndex SamplesInterface  
SamplesFormatted SamplesEmbed SamplesViews  
SamplesPlots SamplesCmds SamplesCorrelat  
SamplesDensity SamplesDiagnostics SamplesHistory  
SamplesQuantiles SamplesTrace

## 22 Subsystems and modules contd

**Graph subsystem is large**

GraphRules GraphNodes GraphLogical GraphStochastic  
GraphScalar GraphVector GraphUnivariate  
GraphMultivariate GraphConjugateMV GraphChain  
GraphConstant GraphCompile GraphStack GraphMixture  
GraphFlat GraphGeneric GraphBlock  
GraphCloglog GraphCut GraphEigenvals GraphGamma  
GraphInprod GraphInverse GraphKepler GraphLog  
GraphLogdet GraphLogit GraphProbit GraphProduct  
GraphRanks GraphPValue GraphSumation GraphTable  
GraphFunctional GraphODEmath GraphODElang  
GraphPredictive GraphBern GraphBinomial GraphCat  
GraphFounder GraphGeometric GraphGEV  
GraphHypergeometric GraphMendelian GraphNegbin  
GraphPoisson GraphRecessive GraphMultinom  
GraphBeta GraphChisqr GraphDbexp GraphExp GraphF  
GraphGamma GraphGengamma GraphLogistic  
GraphLognorm GraphNormal GraphPareto  
GraphPolygene GraphT GraphTrapezium GraphUniform  
GraphWeibull GraphWeibullShifted GraphDirichlet  
GraphMVNormal GraphMVT GraphRENORMAL  
GraphStochtrend GraphWishart

## 23 Subsystems and modules II

**BUGS consists of 15 subsystems**

**5 Windows only subsystems**

**BUGS consists of 263 modules**

**63 windows only modules**

**BUGS is a small system**

## 24 Styles of modules in BUGS

**Many different styles of module in BUGS both within and between subsystems.**

**Example the BugsNames modules contains 78 statements, the BugsInterpreter module contains 20 statements**

**In general modules either implement algorithms or they establish concepts**

**25** What is a module (in CP)

A module is a package of source code with a well defined interface

A module is a unit of compilation

A module is a unit of loading

A module knows what services it provides (syntacticaly)

A module can make "use" of other modules

Under the "use" relation modules are arranged in a DAG

**26** Languages other than CP

Weird languages have weird ideas (they just happened)

Header files

Include

Name spaces

Only classes

main{}

Dynamic link libraries

**27** Software development tools

These tools are never free

These tools are often very complex

These tools often do tasks that are not needed (or should not be needed)

Best to use commonly used tools (it's nice to be in a crowd)

**28** Object orientated software I

Objects are the easy bit

Designing the classes is the hard bit

(Code) Inheritance is evil

Methods should not be extended

Composition is good

## 29 Object orientated software II

Large class hierarchies can be a nightmare

Multiple inheritance deepens that nightmare

Need tools that control the complexity of the hierarchy

Need IDL to describe software

## 30 IDL Interface Definition Language

```
DEFINITION GraphNodes;

TYPE
  Factory = POINTER TO ABSTRACT RECORD
    (f: Factory) New (option: INTEGER): Node, NEW, ABSTRACT
  END;

  List = POINTER TO RECORD
    node-: Node;
    next-: List
  END;

  Node = POINTER TO ABSTRACT RECORD
    props-: SET;
    (node: Node) AddParent (VAR list: List), NEW;
    (node: Node) Check (): SET, NEW, ABSTRACT;
    (node: Node) Init, NEW, ABSTRACT;
    (node: Node) Parents (): List, NEW, ABSTRACT;
    (node: Node) Representative (): Node, NEW, ABSTRACT;
    (node: Node) Set (IN args: Args; OUT res: SET), NEW, ABSTRACT;
    (node: Node) SetProps (props: SET), NEW;
    (node: Node) Signature (OUT signature: ARRAY OF CHAR), NEW, ABSTRACT;
    (node: Node) Size (f: INTEGER, NEW, ABSTRACT);
    (node: Node) Value (): REAL, NEW, ABSTRACT
  END;

  Vector = POINTER TO ARRAY OF Node;

  Args = ABSTRACT RECORD
    valid: BOOLEAN;
    (VAR args: Args) Init, NEW, ABSTRACT
  END;

PROCEDURE SetFactory (f: Factory);

END GraphNodes.
```

## 31 More IDL

```
DEFINITION GraphLogical;
IMPORT GraphNodes;

TYPE
  List = POINTER TO RECORD
    node-: Node;
    next-: List
  END;

  Node = POINTER TO ABSTRACT RECORD (GraphNodes.Node)
    level-: INTEGER;
    parents-: List;
    (node: Node) AddToList (VAR list: List), NEW;
    (node: Node) CalculateLevel, NEW;
    (node: Node) ClassFunction (parent: GraphNodes.Node): INTEGER, NEW,
      ABSTRACT;
    (node: Node) ClearLevel, NEW;
    (node: Node) HandleMsg (msg: INTEGER), NEW, EMPTY;
    (node: Node) Init;
    (node: Node) Optimize (parent: GraphNodes.Node), NEW, EMPTY;
    (node: Node) StoreParents, NEW
  END;

  Vector = POINTER TO ARRAY OF Node;

  Args = RECORD (GraphNodes.Args)
    numConsts, numOps, numScalars, numVectors: INTEGER;
    consts: ARRAY 50 OF REAL;
    scalars: ARRAY 50 OF GraphNodes.Node;
    ops: ARRAY 100 OF INTEGER;
    vectors: ARRAY 10 OF GraphNodes.SubVector;
    (VAR args: Args) Init
  END;

PROCEDURE Ancestors (node: GraphNodes.Node): List;
END GraphLogical.
```

## 32 Metaprogramming

Self awareness for software

Software can ask itself questions

Is there an item called FooBar?

What sort of item is FooBar?

Do this with item FooBar

### 33 Metaprogramming cont

Can ask if a module of given name is loaded and if so to return its metadata

Can ask to load a module of given name and return its metadata

Can ask a module's metadata if it contains an item with a given name and type

Modules metadata limited to what is in the modules interface

### 34 Metaprogramming example

```
DEFINITION GraphT;  
  
  IMPORT GraphNodes;  
  
  VAR fact-: GraphNodes.Factory;  
  
  PROCEDURE Install;  
  
END GraphT.
```

Can ask to load module GraphT and return its metadata

Can ask metadata if there is a procedure called Install (with signature no arguments)

Can ask to execute the Install procedure

### 35 Metaprogramming and BUGS

Used in many places

To support the BUGS language

To load sampling algorithms

To load data reading algorithms

To construct GUI interface

To implement scripting

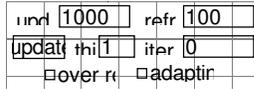
To interface to R

### 36 BUGS language support

Grammar file (snippet)

```
dbern      "GraphBern.Install"  
dbeta     "GraphBeta.Install"  
dbin      "GraphBinomial.Install"  
dcat      "GraphCat.Install"  
dchisqr   "GraphChisqr.Install"  
ddexp     "GraphDbexp.Install"  
dexp      "GraphExp.Install"  
dnorm     "GraphNormal.Install"  
dt        "GraphT.Install"
```

### 37 GUI and BUGS



Definition BugsCmds;

TYPE

```

UpdateDialog = POINTER TO RECORD
iteration-, refresh, thin, updates: INTEGER;
isAdapting-, overRelax: BOOLEAN
END;

```

VAR updateDialog: UpdateDialog;

PROCEDURE Update;

PROCEDURE UpdateGuardWin (VAR par: Dialog.Par);

### 38 Scripting and BUGS

modelCheck(^0) --->

```

"BugsCmds.SetFilePath(^0' ); BugsCmds.ParseGuard;
BugsCmds.ParseFile"

```

modelUpdate(^0) -->

```

"BugsCmds.updateDialog.updates := ^0;
BugsCmds.UpdateGuard; BugsCmds.Update"

```

samplesStats(^0) -->

```

"SamplesCmds.SetVariable(^0); SamplesCmds.StatsGuard;
SamplesCmds.Stats"

```

### 39 R and BUGS makes BRugs

R has a nice paste function

R can talk to dynamic link libraries

Dynamic link library can use metaprogramming to talk to BUGS

Few technical problems: heap management most difficult

BRugs package up on CRAN thanks to Uwe and Sibyle

### 40 R and BUGS's Guts

New OpenBUGS module BugsRobjects to help R see and interact with OpenBUGS internal data structures

Can set node values

Can look at node values

Can program higher level algorithms in R

Can load data / inits from R objects (no need for textual representation)

**41** **Adopt a module (please)**

**BUGS has become OpenBUGS**

**Open source software needs  
active developers**

**OpenBUGS is small and friendly  
(just don't mention C)**

**You can make a difference --  
take a module home today!**