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## B.4 'perc.lsodes.in'

```

#-----
# perc.lsodes.in
#
# Copyright (c) 1993. Don Maszle, Frederic Bois. All rights reserved.
#
#-----

SimType (DefaultSim);

Integrate (Lsodes, 1e-4, 1e-6, 1);

#-----
# The following experiment is for a simulation of one of Dr. Monster's
# exposure experiments described in "Kinetics of Tetracholoroethylene
# in Volunteers; Influence of Exposure Concentration and Work Load,"
# A.C. Monster, G. Boersma, and H. Steenweg,
# Int. Arch. Occup. Environ. Health, v42, 1989, pp303-309
#
# The paper documents measurements of levels of TCE in blood and
# exhaled air for a group of 6 subjects exposed to
# different concentrations of PERC in air.
#
# Inhalation is specified as a dose of magnitude InhMag for the
# given Exposure time.
#
# Inhalation is given in ppm
#-----

Experiment {

  InhMag = 72;           # ppm
  Period = 1e10;        # Only one dose
  Exposure = 240;       # 4 hour exposure

  # measurements before end of exposure and at [5' 30'] 2hr 18 42 67 91 139 163

  Print (C_exh_ug, 239.9 245 270 360 1320 2760 4260 5700 8580 10020 );
  Print (C_ven, 239.9 360 1320 2760 4260 5700 8580 10020 );

}

END.

```

```
Vmax = sc_Vmax * exp (0.7 * log (LeanBodyWt));

} # End of model scaling

#-----
# CalcOutputs
# The following outputs are only calculated just before values
# are saved. They are not calculated with each integration step.
#-----

CalcOutputs {

# Fraction of TCE metabolized per day

Pct_metabolized = (InhMag ?
                  Qmet / (1440 * Flow_alv * InhMag * mg_per_l_per_PPM) :
                  0);

C_exh_ug = C_exh * 1000; # milli to micrograms

} # End of output calculation
```

```

# Quantity metabolized in liver

dQmet_liv = Vmax * Q_liv / (Km + Q_liv);
dt (Q_liv) = Flow_liv * (C_art - Cout_liv) - dQmet_liv;

# Metabolite formation

dt (Qmet) = dQmet_liv;

} # End of Dynamics

#-----
# Scale
# Scale certain model parameters and resolve dependencies
# between parameters. Generally the scaling involves a
# change of units, or conversion from percentage to actual
# units.
#-----

Scale {

# Volumes scaled to actual volumes

BodyWt = LeanBodyWt/(1 - Pct_M_fat);

V_fat = Pct_M_fat * BodyWt/0.92;          # density of fat = 0.92 g/ml
V_liv = Pct_LM_liv * LeanBodyWt;
V_wp  = Pct_LM_wp * LeanBodyWt;
V_pp  = 0.9 * LeanBodyWt - V_liv - V_wp; # 10% bones

# Calculate Flow_alv from total pulmonary flow

Flow_alv = Flow_pul * 0.7;

# Calculate total blood flow from the alveolar ventilation rate and
# the V/P ratio.

Flow_tot = Flow_alv / Vent_Perf;

# Calculate actual blood flows from total flow and percent flows

Flow_fat = Pct_Flow_fat * Flow_tot;
Flow_liv = Pct_Flow_liv * Flow_tot;
Flow_pp  = Pct_Flow_pp * Flow_tot;
Flow_wp  = Flow_tot - Flow_fat - Flow_liv - Flow_pp;

# Vmax (mass/time) for Michaelis-Menten metabolism is scaled
# by multiplication of bdw^0.7

```

```

Flow_alv = 0;          # Alveolar ventilation rate

Vmax = 0;             # kg/minute

#-----
# Dynamics
# Define the dynamics of the simulation. This section is
# calculated with each integration step. It includes
# specification of differential equations.
#-----

Dynamics {

# Venous blood concentrations at the organ exit

Cout_fat = Q_fat / (V_fat * PC_fat);
Cout_wp  = Q_wp  / (V_wp  * PC_wp);
Cout_pp  = Q_pp  / (V_pp  * PC_pp);
Cout_liv = Q_liv / (V_liv * PC_liv);

# Sum of Flow * Concentration for all compartments

dQ_ven = Flow_fat * Cout_fat + Flow_wp * Cout_wp
        + Flow_pp * Cout_pp + Flow_liv * Cout_liv;

# Venous blood concentration

C_ven = dQ_ven / Flow_tot;

# Arterial blood concentration
# Convert input given in ppm to mg/l to match other units

C_art = (Flow_alv * C_inh / PPM_per_mg_per_l + dQ_ven) /
        (Flow_tot + Flow_alv / PC_art);

# Alveolar air concentration

C_alv = C_art / PC_art;

# Exhaled air concentration

C_exh = 0.7 * C_alv + 0.3 * C_inh / PPM_per_mg_per_l;

# Differentials

dt (Q_exh) = Flow_alv * C_alv;
dt (Q_fat) = Flow_fat * (C_art - Cout_fat);
dt (Q_wp)  = Flow_wp  * (C_art - Cout_wp);
dt (Q_pp)  = Flow_pp  * (C_art - Cout_pp);

```



```
C_inh = PerDose (InhMag, Period, 0.0, Exposure);

LeanBodyWt = 55;    # lean body weight

# Percent mass of tissues with ranges shown

Pct_M_fat = .16;   # % total body mass
Pct_LM_liv = .03;  # liver, % of lean mass
Pct_LM_wp = .17;  # well perfused tissue, % of lean mass
Pct_LM_pp = .70;  # poorly perfused tissue, will be recomputed in scale

# Percent blood flows to tissues

Pct_Flow_fat = .09;
Pct_Flow_liv = .34;
Pct_Flow_wp = .50; # will be recomputed in scale
Pct_Flow_pp = .07;

# Tissue/blood partition coefficients

PC_fat = 144;
PC_liv = 4.6;
PC_wp = 8.7;
PC_pp = 1.4;
PC_art = 12.0;

Flow_pul = 8.0;    # Pulmonary ventilation rate (minute volume)
Vent_Perf = 1.14;  # ventilation over perfusion ratio

sc_Vmax = .0026;   # scaling coefficient of body weight for Vmax

Km = 1.0;

# The following parameters are calculated from the above values in
# the Scale section before the start of each simulation.
# They are left uninitialized here.

BodyWt = 0;

V_fat = 0;        # Actual volume of tissues
V_liv = 0;
V_wp = 0;
V_pp = 0;

Flow_fat = 0;     # Actual blood flows through tissues
Flow_liv = 0;
Flow_wp = 0;
Flow_pp = 0;

Flow_tot = 0;     # Total blood flow
```

### B.3 'perc.model': A sample model description file

```

#-----
# perc.model
# A four compartment model of Tetrachloroethylene (PERC)
# and total metabolites.
# Copyright (c) 1993. Don Maszle, Frederic Bois. All rights reserved.
#-----
# States are quantities of PERC and metabolite formed, they can be output

States = {Q_fat,          # Quantity of PERC in the fat
          Q_wp,          # ... in the well-perfused compartment
          Q_pp,          # ... in the poorly-perfused compartment
          Q_liv,         # ... in the liver
          Q_exh,         # ... exhaled
          Qmet};        # Quantity of metabolite formed

# Extra outputs are concentrations at various points

Outputs = {C_liv,        # mg/l in the liver
           C_alv,        # ... in the alveolar air
           C_exh,        # ... in the exhaled air
           C_ven,        # ... in the venous blood
           Pct_metabolized, # % of the dose metabolized
           C_exh_ug};   # ug/l in the exhaled air

Inputs = {C_inh}        # Concentration inhaled

# Constants
# Conversions from/to ppm: 72 ppm = .488 mg/l

PPM_per_mg_per_l = 72.0 / 0.488;
mg_per_l_per_PPM = 1/PPM_per_mg_per_l;

#-----
# Nominal values for parameters
# Units:
# Volumes: liter
# Vmax:    mg / minute
# Weights: kg
# Km:     mg / minute
# Time:   minute
# Flows:  liter / minute
#-----

InhMag = 0.0;
Period = 0.0;
Exposure = 0.0;

```

```

SDw_ka = 0;
SDb_ke = 0;
SDw_ke = 0;
SDb_V = 0;
min_F = 0;
max_F = 0;
SD_C_central = 0;
SD_AUC = 0;
CV_C_cen = 0;
CV_AUC = 0;
CV_C_cen_true = 0;
CV_AUC_true = 0;

# Calculate Outputs
CalcOutputs {

# algebraic equation for C_central
C_central = (ka != ke ?
              (exp(-ke * t) - exp(-ka * t)) *
              F * ka * Dose / (V * (ka - ke))) :
              exp(-ka * t) * ka * t * F * Dose / V);

# algebraic equation for AUC
AUC = (ka != ke ?
        ((1 - exp(-ke * t)) / ke - (1 - exp(-ka * t)) / ka) * F * ka * Dose /
        (V * (ka - ke))) :
        F * Dose * (1 - (1 + ka * t) * exp(-ka * t)) / (V * ke));

C_central = C_central + NormalRandom(0, C_central * CV_C_cen_true);
AUC = AUC + NormalRandom(0, AUC * CV_AUC_true);

ln_C_central = (C_central > 0 ? log (C_central) : -100);
ln_AUC = (AUC > 0 ? log (AUC) : -100);

SD_C_computed = (C_central > 0 ? C_central * CV_C_cen : 1e-10);
SD_A_computed = (AUC > 0 ? AUC * CV_AUC : 1e-10);

} # End of output calculations

```

## Appendix B Examples

You will find here some examples of model description files and simulation input files.

### B.1 ‘linear.model’

```
# Linear Model with a random component
# y = A + B * time + N(0,SD_true)
# Setting SD_true to zero gives the deterministic version
#-----

# Outputs
Outputs = {y};

# Model Parameters
A = 0;
B = 1;
SD_true = 0;
SD_esti = 0;

CalcOutputs { y = A + B * t + NormalRandom(0,SD_true); }
```

### B.2 ‘1cpt.model’: A sample model description file

```
# One Compartment Model
# First order input and output
#-----

# Inputs
Inputs = {Dose};

# Outputs
Outputs = {C_central, AUC, ln_C_central, ln_AUC,
          SD_C_computed, SD_A_computed};

# Model Parameters
ka = 1;
ke = 0.5;
F = 1;
V = 2;

# Statistical Parameters
Sdb_ka = 0;
```



## Appendix A Using `make`

`Make` is a utility that facilitates doing repetitive tasks like compilation. A `'makefile'` is a text file that contains a description of what `make` should do and under what circumstances. For example the compilation `'Makefile'` included with the MCSim distribution only compile a C-file if it has changed since the last compilation. This means that when you change your model and create a new `'model.c'` file using `mod`, only the `'model.c'` file needs to be compiled to recreate the simulation engine.

Before you run `make` for the first time on a machine you must change some settings in the makefile to specify where your C compiler is on your file system, and some special settings for that compiler. Refer to the documentation (or manual pages in Unix) for your compiler to do this. In the makefile file there are several variables defined which you may need to change. They are described in the makefile itself.

You run the `make` program by entering `make` or `make -f Makefile` at the prompt from the directory where the program is that you want to compile.



## 7 Common Pitfalls

The following mistakes are particularly easy to make, and sometimes hard to notice, or understand at first.

- Putting a space before the end of line `;` in the model definition file may causes strange error messages.
- Forgetting about type-related arithmetics in C: `'1000/882'` gives `'1'` since it is interpreted as an integer division by the compiler. To get a floating-point (usual) division use `'1000./882.'`.



Park, S. K. and Miller, K. W. (1988). Random number generators: good ones are hard to find. *Communications of the ACM* **31**:1192-1201.

Press, W. H., Flannery, B. P., Teukolsky, S. A. and Vetterling, W. T. (1989). *Numerical Recipes* (2st ed.). Cambridge University Press, Cambridge.

Smith, A. F. M. (1991). Bayesian computational methods. *Philosophical Transactions of the Royal Society of London, Series A* **337**:369-386.

Smith, A. F. M. and Roberts, G. O. (1993). Bayesian computation via the Gibbs sampler and related Markov chain Monte Carlo methods. *Journal of the Royal Statistical Society Series B* **55**:3-23.

Vattulainen, I., Ala-Nissila, T. and Kankaala, K. (1994). Physical tests for random numbers in simulations. *Physical Review Letters* **73**:2513-2516.

## Bibliographic References

Barry, T. M. (1996). Recommendations on the testing and use of pseudo-random number generators used in Monte Carlo analysis for risk assessment. *Risk Analysis* **16**:93-105.

Bernardo, J. M. and Smith, A. F. M. (1994). *Bayesian Theory*. Wiley, New York.

Bois, F. Y., Gelman, A., Jiang, J., Maszle, D., Zeise, L. and Alexeef, G. (1996). Population toxicokinetics of tetrachloroethylene. *Archives of Toxicology* **70**:347-355.

Bois, F. Y., Zeise, L. and Tozer, T. N. (1990). Precision and sensitivity analysis of pharmacokinetic models for cancer risk assessment: tetrachloroethylene in mice, rats and humans. *Toxicology and Applied Pharmacology* **102**:300-315.

Gear, C. W. (1971a). Algorithm 407 - DIFSUB for solution of ordinary differential equations [D2]. *Communications of the ACM* **14**:185-190.

Gear, C. W. (1971b). The automatic integration of ordinary differential equations. *Communications of the ACM* **14**:176-179.

Gelman, A. (1992). Iterative and non-iterative simulation algorithms. *Computing Science and Statistics* **24**:433-438.

Gelman, A., Bois, F. Y. and Jiang, J. (1996). Physiological pharmacokinetic analysis using population modeling and informative prior distributions. *Journal of the American Statistical Association* **91**:1400-1412.

Gelman, A., Carlin, J. B., Stern, H. S. and Rubin, D. B. (1995). *Bayesian Data Analysis*. Chapman & Hall, London.

Gelman, A. and Rubin, D. B. (1992). Inference from iterative simulation using multiple sequences (with discussion). *Statistical Science* **7**:457-511.

Hammersley, J. M. and Handscomb, D. C. (1964). *Monte Carlo Methods*. Chapman and Hall, London.

Manteufel, R. D. (1996). Variance-based importance analysis applied to a complex probabilistic performance assessment. *Risk Analysis* **16**:587-598.

The tab-delimited file can easily be imported into your favorite spreadsheet, graphic or statistical package for further analysis.

## 6.7 Error Handling

If integration fails for an **Experiment** in **DefaultSim** simulations no output is generated for that experiment, and the user is warned by an error message on the screen. In **MonteCarlo** or **SetPoints** simulations, the corresponding simulation line is not printed, but the iteration number is incremented. Finally, in **MCMC** simulations, the parameter for which the data likelihood was computed is simply not updated (which implicitly forbids the uncomputable region of the parameter space). In all cases an error message is given on the screen, or wherever the screen output has been redirected.

An important concept to grasp here is that of "instance". In the code fragment given above, the parameter  $A$ , defined at sub-level 1, is "cloned" as many times as there are sub-levels or experiments enclosed in sub-level 1 (hence, it will be cloned twice in the example above, once for each **Experiment** defined). In that way, the parameters distributions defined at one level in fact apply to the next lower sub-level, or at the **Experiment** level. This convention saves a lot writing and effort in the long run. For example, the uniform distribution assigned to  $A$ , at the top level, applies to the sub-level 1. There is only one "clone" of  $A$  at sub-level 1 since only one sub-level is included in the top level. In contrast, two normally-distributed "clones" of  $A$  will be defined and sampled. The first one will apply to experiment 1, and will be conditioned by the data of that experiment only, and the other will apply to experiment 2. A total of three variables of "type"  $A$  will be sampled and will be printed in the output file (coded so that the position in the hierarchy is apparent): the "parent"  $A(1)$ , a priori uniformly distributed, and two "dependents"  $A(1.1)$  and  $A(1.2)$ , a priori normally distributed around  $A(1)$ .

## 6.6 Analyzing results

The output from Monte Carlo or **SetPoints** simulations is a tab-delimited text file with one row for each run (i.e., parameter set) and one column for each parameter and output in the order specified. Thus each line of the output file is in the following order:

```
<# of run> <parameters> <outputs for Exp 1> <outputs for Exp2> ...
```

The parameters are printed in the order they were sampled or set.

The first line gives the column headers. A variable called *name* requested for output in an experiment  $i$  at a time  $j$  is labeled *name<sub>i,j</sub>*.

The output of Markov chain Monte Carlo simulations is also a text file with one row for each run. It displays a column of iteration labels, and one column for each parameter sampled. The last three columns contain respectively, the sum of the logarithms of each parameter's density given its parents' values ('LnPrior'), the logarithm of the data likelihood ('LnData'), and the sum of the previous two values ('LnPosterior'). The first line gives the column headers. On this line, parameters names are tagged with a code identifying their position in the hierarchy defined by the Level statements. For example, the second instance of a parameter called *name* placed at the first level of the hierarchy is labeled *name(2)*; the first instance of the same parameter placed at the second instance of the second level of the hierarchy is labeled *name(2.1)*, etc.

specified via a `PrintStep()` specification (see Section 6.4.4 [`PrintStep()` specification], page 35), since they are equally spaced. More generally, a `Print()` specification could have been used (see Section 6.4.3 [`Print()` specification], page 34). The data values are given in a `Data()` statement.

### 6.5.1 Level definition

Markov chain Monte Carlo simulations require the definition of a statistical model and the use of the *Level* keyword. At least one level must be defined. A level section starts with the keyword `Level` and is enclosed in curly braces. It can include any number of sub-levels or `Experiments`. `Experiments` (where the data are specified) form the lowest level of the hierarchy (see Section 6.4.1 [Experiment definition], page 33). There must be one and only one top level and at most 10 sub-levels in the hierarchy. This limit of 10 levels can be increased (up to 255) by changing `MAX_LEVELS` in the header file `'sim.h'` and recompiling.

A level can make modifications to the sampling distribution of any model parameter. For example:

```
Level { # this is the top level

    Distrib(A, Uniform, 0, 1);

    Level { # this is sub-level 1
        Distrib(A, Normal, A, 1);
        Experiment { ... } # experiment 1
        Experiment { ... } # experiment 2
    }
}
```

These distribution assignments apply to all sub-levels of the level where they take place. If several assignments are given, their position within the level section is irrelevant (although a logical order is recommended for clarity).

A level can also make modifications to any model parameter that was defined in the global section of the model description file. The syntax is the same, except that variables can only take constant values. So, for example, in an experiment, the parameter *A* could be modified with:

```
A = 2.0;
```

This overrides any previously assigned values, even if randomly sampled, for the specified parameter. This assignment also applies to the sub-levels of the level where they take place.

We now need to write an input file specifying the distribution of  $y$  (*i.e.*, the likelihood), and the prior distributions of the various parameters. Here is what such a file could look like:

```
# -----
# Simulation input file for a linear regression
# -----
SimType (MCMC);
MCMC ("linear.MCMC.out", "", "", 50000, 0, 5, 40000, 63453.1961);
Level {
  Distrib(Alpha, Normal_v, 0, 10000);
  Distrib(Beta, Normal_v, 0, 10000);
  Distrib(Sigma2, InvGamma, 0.01, 0.01);
  Distrib(y, Normal_v, Prediction(y), Sigma2);
  Experiment {
    x_bar = 3.0;
    PrintStep (y, 1, 5, 1);
    Data (y, 1, 3, 3, 3, 5);
  }
} # end Level
End
# -----
```

The file begins the obvious `SimType()` (see Section 6.3.1 [`SimType()` specification], page 25) and `MCMC()` (see Section 6.3.6 [`MCMC()` specification], page 30) keywords. The keyword `Level` comes next. `Level` is used to specify the dependence between model parameters in a hierarchy. There should be at least one `Level` in every MCMC input file, even for a non-hierarchical model like the one above (actually, "non-hierarchical" models can be thought of as having only one level of hierarchy). See below for further discussion of the `Level` keyword. You can also look at the MCMC input files provided as examples with MCSim source code. The `Distrib()` statements define the parameter priors. `Normal_v` specifications are used since we use variances instead of standard deviations. The inverse-Gamma distribution is used for the variance component, since the precision is supposed to be Gamma-distributed. The likelihood is the distribution of the data, given the model: it is also specified by a `Distrib()` statement, valid for every  $y$  data point. Again, note that the  $\mu$  variable is not used. Instead the `Prediction(y)` specification is used to signify the linear model output. These distributions are in effect for every sub-level or every `Experiment` included in the current level.

The "simulations" to perform, and the corresponding data values, are specified by the `Experiment` section. Only one `Experiment` is needed here, but several could be specified. In this section, the value of  $\bar{x}$  is provided. The different values of  $x$  (time in our model) can be

is treated as "missing data" and ignored in likelihood calculations. The convention "-1" can be changed by changing INPUT\_MISSING\_VALUE in the header file 'mc.h' and recompiling.

## 6.5 Specifying a statistical model

Statistical models are defined in the simulation specification file, rather than in the model definition file. It is necessary to define a statistical model (with parameter dependencies, prior distributions and likelihood) if you want to use MCMC sampling. MCMC sampling will then give you in output a sample of parameters drawn from their joint posterior distribution. Take for example the simple linear regression model:

$$y_i = N(\mu_i, \sigma^2) \quad (1)$$

$$\mu_i = \alpha + \beta(x_i - \bar{x}) \quad (2)$$

where the observed  $(x, y)$  pairs are  $(1, 1)$ ,  $(2, 3)$ ,  $(3, 3)$ ,  $(4, 3)$  and  $(5, 5)$ . The quantities  $\alpha$  and  $\beta$  are given  $N(0, 10000)$  priors, and  $1/\sigma^2$  is given a  $Gamma(10^{-3}, 10^{-3})$  prior. We want the posterior distributions of  $\alpha$ ,  $\beta$ , and  $\sigma^2$ .

The first thing to do is to define a model to compute  $y$  as a function of  $x$ . Here is such a model (quite similar to the one distributed with MCSim source code (see Section B.1 [linear.model], page 47):

```
# -----
# Model definition file for a linear model
# -----
Outputs = {y};

# Model parameters
Alpha = 0;
Beta = 0;
Sigma2 = 1;
x_bar = 0;

CalcOutputs { y = Alpha + Beta * (t - x_bar); }
# -----
```

The parameters' initialization values are arbitrary, and could be anything reasonable. They will be changed or sampled through the input file. Note that  $\sigma^2$  is not used in the model equations, but still needs to be defined here in order to be part of the statistical model. On the other hand,  $\mu$  is not defined, since we do not really need it. Finally  $x$  is replaced by the time,  $\mathbf{t}$ , for convenience. An alternative would be to define an input ' $\mathbf{x}$ ' and use it instead of  $\mathbf{t}$ .

```
Print(<identifier1>, <identifier2>, ..., <time1>, <time2>, ...);
```

The same output times are used for all the variables specified. The size of the time list is only limited by the available memory. The limit of 10 variables names can be increased by changing `MAX_PRINT_VARS` in the header file `'sim.h'` and recompiling. The number of `Print()` statements you can use in a given `Experiment` section is only limited by the available memory.

#### 6.4.4 `PrintStep()` specification

The value of any model variable, input or parameter can be also output with *PrintStep* specifications. They allow dense printing, suitable for smooth plots, for example. The arguments are the name of only one variable, the first output time, the last one, and a time increment:

```
PrintStep(<identifier>, <start-time>, <end-time>, <time-step>);
```

The final time has to be superior to the initial time and the time step has to be less than the time span between end and start. If the time step is not an exact divider of the time span the last printing step is shorter and the last output time is still the end-time specified. The number of outputs produced is only limited by the memory available at run time. You can use several `PrintStep()` in a given `Experiment` section.

#### 6.4.5 `Data()` specification

Experimental observations of model variables, inputs, outputs, or parameters, can be specified with the *Data()* command. Markov chain Monte Carlo sampling requires that you specify `Data()` statements (see Section 6.3.6 [`MCMC()` specification], page 30; see Section 6.5.1 [Specifying a statistical model], page 38). The data are then used internally to evaluate the likelihood function for the model. The arguments are the name of the variable for which observations exist, and a list of data values:

```
Data(<identifier>, <value1>, <value2>, ...);
```

This specification can only be used with a matching `Print()` or `PrintStep()` for the same variable (see Section 6.4.3 [`Print()` specification], page 34; see Section 6.4.4 [`PrintStep()` specification], page 35). You must make sure that there are as many data values in the `Data()` specification as output time requested in the corresponding `Print()` or `PrintStep()`. A data value of `"-1"`



This overrides any previously assigned values, even if randomly sampled, for the specified parameter.

Inputs can be redefined with the input functions listed in the **Mod** reference section above (see Chapter 5 [Defining Models], page 13). Input functions can reference other variables (eventually random), as in:

```
Q_gav = PerExp(GavMag, 60, 0, RateConst);
```

The maximum number of experiments definable is 200. This can be changed by changing `MAX_INSTANCES` and `MAX_EXPERIMENTS` in the header file `'sim.h'` and recompiling. Within an experiment definition, or at the global level (if you want them to apply to all experiments), several additional specifications can also be used:

- *StartTime()*,
- *Print()*,
- *PrintStep()*,
- *Data()*.

### 6.4.2 *StartTime()* specification

The origin of time for a simulation, if it needs to be defined, is specified with the *StartTime()* specification:

```
StartTime(<initial-time>);
```

If this specification is not given, a value of zero is used by default. The final time is automatically computed to match the largest output time specified in the `Print()` or `PrintStep()` statements (see Section 6.4.3 [Print() specification], page 34; see Section 6.4.4 [PrintStep() specification], page 35).

### 6.4.3 *Print()* specification

The value of any model variable, input, output or parameter can be requested for output with *Print()* specifications. Their arguments are a list of names of variables (at least one and up to 10), and a list of increasing times at which to output their value:

If a null string is given for the output filename, the set points output will be written to the same default output file used for Monte Carlo analyses, `'simmc.out'`.

The set points file name is required and must refer to an existing file containing the parameter values to use. The first line of the set points file is skipped and can contain column headers, for example. Each of the other lines should contain an integer (e.g., the line number) followed by values of the various parameters in the order indicated in the `SetPoints()` specification. If extra fields are at the end of each line they are skipped. The first integer field is needed but not used (this allows you to directly use Monte Carlo output files for additional `SetPoints` simulations).

The variable `nRuns` should be less or equal to the number of lines (minus one) in the set points file. If a zero is given, all lines of the file are read. The format of the output file of set points simulations is discussed below (see Section 6.6 [Analyzing results], page 39).

Following the `SetPoints()` specification, `Distrib()` statements can be given for parameters not already in the list (see Section 6.3.5 [`Distrib()` specification], page 28). These parameters will be sampled accordingly before to performing each simulation. The shape parameters of the distribution specifications can reference other parameters, including those of the list.

## 6.4 Specifying basic conditions to simulate

Any simulation file must define at least one `Experiment` to simulate.

### 6.4.1 Experiment definition

After global simulation specifications, "experiments" must be included in the input file. They define simulation conditions and specify outputs. An "experiment" section starts with the keyword *Experiment* and is enclosed in curly braces.

An "experiment" can make modifications to any model variable or parameter that was defined in the global section of the model description file. The syntax is the same, except that variables or parameters can only take constant values. So, for example, in an experiment the body weight could be modified with:

```
BodyWt = 83.2;
```

To recapitulate, the extended `Distrib()` syntax, for use with MCMC simulations is therefore:

```
Distrib(<identifier>, <iType>, [<shape parms>]);
```

where the first two shape parameters can be `Prediction(<identifier>)`, or any model parameter or numerals, and the last two shape parameters numerals only (this limitation will also be removed in a future release).

If a statement like:

```
Distrib(Var, <iType>, Prediction(<Var>), Prediction(<Other_Var>), ...);
```

is used, the two variables *Var* and *Other\_Var* must have identical output times. It is then useful to group them in the same `Print()` statement.

The other tool MCSim brings you to build a complete statistical model is the `Level` keyword. The use of this keyword, is described below (see Section 6.5.1 [Specifying a statistical model], page 38).

Finally, the format of the output file of MCMC simulations is discussed in a later section (see Section 6.6 [Analyzing results], page 39).

### 6.3.7 `SetPoints()` specification

To impose a series of set points (i.e., already tabulated values for the parameters), the global section can include a `SetPoints()` specification. It allows you to perform additional simulations with previously Monte Carlo sampled parameter values, eventually filtered. You can also generate parameters values in a systematic fashion, over a grid for example, with another program, and use them as input to MCSim. Importance sampling, latin hypercube sampling, grid sampling, can be accommodated in this way.

This command specifies an output filename, the name of a text file containing the chosen parameter values, the number of simulations to perform and a list of model parameters to vary. It has the following syntax:

```
SetPoints("<OutputFilename>", "<SetPointsFilename>", <nRuns>,
         <identifier>, <identifier>, ...);
```

numbers, printing times, data values and the corresponding model predictions, computed using the last parameter vector of the restart file. This is useful to quickly check the model fit to the data. If *simTypeFlag* is equal to 2, the entire restart file is used to compute the parameters' covariance matrix. All parameters are then updated at once using a multivariate normal kernel as proposal distribution of the Metropolis steps. This results in large improvement in speed. However, we recommend that this option be used only when convergence is approximately obtained (therefore, you should run MCMC simulations with *simTypeFlag* set to 0 first, up to approximate convergence, and then restart the chain with the flag at 2).

The integer *printFrequency* should be set to 1 if you want an output at each iteration, to 2 if you want an output at every other iteration etc. *itersToPrint* is the number of final iterations for which output is required (e.g., 1000 will request output for the last 1000 iterations; to print all iterations just set this parameter to the value of *nRuns*). Note that if no restart file is used, the first iteration is always printed, regardless of the value of *itersToPrint*. Finally, the seed of the pseudo-random number generator can be any positive real number. Seeds between 1.0 and 2147483646.0 are used as is, others are rescaled silently within those bounds.

To use the MCMC specification, you must define a statistical model precising each parameter's prior distribution, or conditional distribution (in the case of a hierarchical model), and the data likelihood (i.e., the distribution of observation errors). These distributions must be enclosed in a **Level** section and are specified with **Distrib()** statements (see Section 6.5.1 [Specifying a statistical model], page 38). In the context of MCMC sampling, MCSim provides an extension of the **Distrib()** specification. First, the first two shape parameters of distributions may depend on other model parameters. For example:

```
Distrib(A, Normal, 0, 1);
Distrib(B, Normal, A, C);
```

The data distribution is given by a similar statement, which uses the specification *Prediction()* to differentiate data from their predicted counterparts. The **Prediction()** specification can be used for the first two shape parameters only (therefore, not for ranges, except in the case of uniform or loguniform distributions). If **Prediction()** is used for the first shape parameter, the variable enclosed in parentheses must be the same as the variable whose distribution is described. There should be one and only one distribution specified for a given type of data in the whole input file (i.e., you cannot redefine a likelihood; this limitation will hopefully be removed in a future release). Note that only states and outputs can use **Prediction()** specifications (but you can always define an output to be equal to a parameter or an input in your model file). For example:

```
Distrib(y, TruncNormal, Prediction(y), Prediction(z), -10, 10);
```

```
Distrib(B, Normal, A, 2);
```

### 6.3.6 MCMC() specification

Markov chain Monte Carlo (MCMC) simulations, used in a Bayesian context, allow the user to specify a statistical model (eventually hierarchical) and sample parameters from their joint posterior distribution, given a prior distribution for each parameter, a set of data to simulate, and corresponding likelihoods. Sampling from the posterior is not immediate: it requires the simulation chain, which start by sampling purely from the prior, to reach equilibrium. Checking that equilibrium is obtained is best achieved, in our opinion, by running multiple independent chains. Hence these computations are very intensive. For a discussion of Markov chain Monte Carlo and convergence issues you should consult the appropriate statistical literature (for example, Bernardo and Smith, 1994; Gelman, 1992; Gelman et al., in press; Gelman et al., 1995; Gelman and Rubin, 1992; Smith, 1991; Smith and Roberts, 1993) (see [Bibliographic References], page 41). Technically, MCSim uses Metropolis-Hasting sampling and you do not need to worry about issues of conjugacy or log-concavity of your prior or posterior distributions. Like simple Monte Carlo simulations, MCMC simulations require the use of two specifications, *MCMC()* and *Distrib()* and of one special section definition: *Level*. The syntax for the *MCMC()* specification is:

```
MCMC("<OutputFilename>", "<RestartFilename>", "", <nRuns>,
      <simTypeFlag>, <printFrequency>, <itersToPrint>, <RandomSeed>);
```

The output filename is a string field and must be enclosed in quotes. If a null-string "" is given, the default name 'MCMC.default.out' will be used.

If a restart file name (enclosed in quotes) is given, the first simulations will be read from that file (which must be a text file). This allows you to continue a chain where you left it, since an MCMC output file can be used as a restart file with no change. Note that the first line of the file (which typically contains column headers) is skipped. Also, the number of lines in the file must be less than or equal to *nRuns*. The first column of the file should be integers, and the following columns (tab- or space-separated) should give the various parameters, in the same order as specified in the list of *Distrib()* specifications in the input file. The third field is reserved for future use and should just be a pair of empty quotes.

The integer *nRuns* gives the total number of runs to be performed, including the runs eventually read in the restart file. The next field, *simTypeFlag* should be either 0, 1, or 2. It should be set at zero to start a chain of MCMC simulations. In that case, parameters are updated by Metropolis steps, one at a time. If the value of *simTypeFlag* is set to 1 or 2, a restart file must also be specified. In the case of 1, the output file will contain codes for the level sequence, experiment

- Normal distribution (two reals numbers): mean and standard deviation, the latter being strictly positive. The variant `Normal_v` takes the variance instead of the standard deviation as second parameter.
- Truncated normal distribution (four reals numbers): mean, standard deviation (strictly positive), minimum and maximum. The variant `TruncNormal_v` takes the variance instead of the standard deviation as second parameter.
- LogNormal distribution (two reals numbers): geometric mean (exponential of the mean in log-space) and geometric standard deviation (exponential, strictly superior to 1, of the standard deviation in log-space). The variant `LogNormal_v` takes the variance (in log-space!) instead of the standard deviation as second parameter.
- Truncated Lognormal distribution (four reals numbers): geometric mean and geometric standard deviation (strictly superior to 1), minimum and maximum in natural space. For example:

```
Distrib(Var, TruncLogNormal, 1, 2.718, 0.01, 10)
```

samples `Var` such that  $\ln(Var)$  is a standardized normal variate – of mean  $\ln(1) = 0$  and standard deviation  $\ln(2.718) = 1$  — while `Var` is truncated to fall between 0.01 to 10. The variant `TruncLogNormal_v` takes the variance (in log-space!) instead of the standard deviation as second parameter.

- Beta distribution (at least two strictly positive real numbers): *A* and *B*. By default the Beta distribution is defined over the interval  $[0;1]$ . If a range is given for the beta distribution, the  $[0;1]$  interval is mapped onto the specified range.
- Gamma distribution (two strictly positive real numbers): shape *a* and inverse scale *b*.
- Inverse-gamma distribution (two strictly positive real numbers): shape *a* and scale *b*.
- Chi-squared distribution (one strictly positive real number): *n*. This distribution is the same as  $\text{Gamma}(n/2, 1/2)$ .
- Exponential distribution (one strictly positive real number): inverse-scale *b*. The density of this distribution is equal to  $be^{-bx}$ .
- Binomial distribution (two strictly positive numbers, a real and an integer): *p* (in the interval  $[0;1]$ ), and *N*. If *N* is not input as an integer it will be rounded down during the simulations.
- Poisson distribution (a strictly positive real): rate *l*.
- Piecewise distribution (four reals): *minimum*, *a*, *b*, *maximum*. The distribution has the form of a truncated triangle, with a plateau between *a* and *b*. If *a* = *b*, the distribution is the triangular distribution.

The shape parameters of the above distribution specifications can reference other parameters, provided than distributions for these have already been defined. For example:

```
Distrib(A, Normal, 0, 1);
```

### 6.3.5 `Distrib()` specification

This specification indicates which variable to sample, and its sampling distribution. One *Distrib()* specification must be included for each variable to sample. The specification file can include any number of these commands at the global level, or within any **Level** section in the case of Markov chain Monte Carlo sampling (see Section 6.5.1 [Specifying a statistical model], page 38). The syntax is:

```
Distrib(<identifier>, <iType>, [<shape parms>]);
```

The *iType* field specifies the sampling distribution to use and can be one of following:

- *Uniform*,
- *LogUniform*,
- *Normal*,
- *Normal\_v*,
- *LogNormal*,
- *LogNormal\_v*,
- *TruncNormal*,
- *TruncNormal\_v*,
- *TruncLogNormal*,
- *TruncLogNormal\_v*,
- *Beta*,
- *Gamma*,
- *InvGamma*,
- *Chi2*,
- *Exponential*,
- *Binomial*,
- *Poisson*,
- *Piecewise*.

The corresponding shape parameters (Bernardo and Smith, 1994; Gelman et al., 1995) (see [Bibliographic References], page 41) are as follow:

- Uniform and log-uniform distributions: minimum and maximum of the sampling range, real numbers in natural space.

If the `Integrate()` specification is not used, the default integration method is `Lsodes` with parameters  $10^{-5}$ ,  $10^{-7}$  and 1. We recommend using `Lsodes`, since it is highly accurate and efficient. `Euler` can be used for special applications (e.g., in system dynamics) where a constant time step and a simple algorithm are needed.

### 6.3.3 `OutputFile()` specification

The `OutputFile()` specification allows you to specify a name for the output file of `DefaultSim` simulations. If this specification is not given the name `'sim.out'` is used if none has been supplied on the command-line or the initial dialog. The corresponding syntax is:

```
OutputFile("<OutputFilename>");
```

### 6.3.4 `MonteCarlo()` specification

Monte Carlo simulations (Hammersley and Handscomb, 1964; Manteufel, 1996) (see [Bibliographic References], page 41) require the use of two specifications, `MonteCarlo()` and `Distrib()`, which must appear in the global section of the file, before the `Experiment` sections. Such Monte Carlo specifications are ignored if they appear in an `Experiment` specification.

The `MonteCarlo` specification gives general information required for the runs: the output file name, the number of runs to perform, and a starting seed for the random number generator. Its syntax is:

```
MonteCarlo("<OutputFilename>", <nRuns>, <RandomSeed>);
```

The output filename is a string field and must be enclosed in quotes. If a null-string "" is given, the default name `'simmc.out'` will be used. The seed of the pseudo-random number generator can be any positive real number. Seeds between 1.0 and 2147483646.0 are used as is, others are rescaled within those bounds (and a warning is issued). Here is an example of use:

```
MonteCarlo("percsimmc.out", 5, 9386.630);
```

The parameters' sampling distributions are specified by a list of `Distrib` specifications, as explained in the next section. The format of the output file of Monte Carlo simulations is discussed later (see Section 6.6 [Analyzing results], page 39).



- *MCMC* (previously *Gibbs*): Markov chain Monte Carlo simulations are performed to attain the posterior distribution of the model's parameters, given their prior distributions — that you specify — and data for which the likelihood function can be computed (see Section 6.3.6 [MCMC() specification], page 30),
- *SetPoints*: the experiments are simulated using several lists of user-defined parameters values in input (see Section 6.3.7 [SetPoints() specification], page 32).

If `MonteCarlo`, `MCMC`, or `SetPoints` simulations are requested, additional specifications are needed (see below).

### 6.3.2 Integrate() specification

The integrator settings can be changed with the *Integrate* specification. Two integration routines are provided: *Lsodes* (which originates from the SLAC Fortran library and is originally based on Gear's routine) (Gear, 1971b; Gear, 1971a; Press et al., 1989) (see [Bibliographic References], page 41) and *Euler* (Press et al., 1989).

The syntax for `Lsodes` is:

```
Integrate(Lsodes, <rtol>, <atol>, <method>);
```

*Rtol* is a scalar specifying the relative error tolerance for each integration step. *Atol* is a scalar specifying the absolute error tolerance parameter. They apply to all integration variables (state variables). The estimated local error in a state variable  $y(i)$  will be controlled so as to be roughly less (in magnitude) than  $rtol \times |y(i)| + atol$ . Thus the local error test passes if, in each component, either the absolute error is less than *atol*, or the relative error is less than *rtol*. Set *rtol* to zero for pure absolute error control, and use *atol* to zero for pure relative error control. Caution: actual (global) errors may exceed these local tolerances, so choose them conservatively. The *method* flag should be 0 (zero) for non-stiff differential systems and 1 for stiff systems. You should try both and select the fastest for equal accuracy of output, unless insight from your system leads you to choose *a priori*. In our experience, a good starting point for *atol* and *rtol* is about  $10^{-6}$ .

The syntax for `Euler` is:

```
Integrate(Euler, <time-step>, 0, 0);
```

*time-step* is a scalar specifying the constant time-step to be taken at each integration step. The next two scalars are reserved for future use and should be set to zero.

```

# Input file (this is a comment)
SimType(MCMC);
<Global modifications and analysis specifications>
Level {
  # Up to 10 levels of hierarchy
  Experiment {
    Specifications for first experiment
  }
  Experiment {
    Specifications for second experiment
  }
  # Unlimited number of experiment specifications
} # end Level
End # Optional statement. Everything after this line is ignored

```

## 6.3 Global specifications

The global section is used to give specifications relevant to all experiments, for example specification of the type of analysis, how the integrator should work, parameter modifications to be used for all experiments, etc.

Both the global section and each experiment section can contain modifications to defined model variables. At the beginning of a simulation, all model parameters are initialized to the nominal values specified in the model description file. Next, modifications given in the global section are applied, and finally any modifications for the current experiment are applied.

### 6.3.1 `SimType()` specification

The type of analysis performed is specified using the *SimType()* specification. Example:

```
SimType(MonteCarlo);
```

The following keywords can be used:

- *DefaultSim*: the list of specified experiments is simulated,
- *MonteCarlo*: the specified experiments are simulated several times with random input parameters (see Section 6.3.4 [*MonteCarlo()* specification], page 27),

## 6.2 Syntax of the simulation definition file

The file starts with a global declaration section followed by a number of *Experiment* (i.e., simulation) definitions (see Section 6.4.1 [Experiment definition], page 33), eventually enclosed in a *Level* definition if Markov chain Monte Carlo simulations are to be performed (see Section 6.5.1 [Specifying a statistical model], page 38). Each **Experiment** defines simulation conditions, from an initial time (or whatever your dependent variable represents) to a final time. The initial values of model state variables, parameter values, input variables, and which outputs are to print at which times can all be changed in a given **Experiment**.

The general syntax of the file is the same as that of **mod** with two differences:

- Variables can only be assigned constant values.
- Input variables' assignments can use any input function (including the **NDoses()** function) or constant values.

Expressions are not allowed (unlike in the model definition file where they can be used). Similarly, structural change to the model, for instance, addition of a state, input, output or parameter, cannot be done here and must be done in the model description file. The simulation specification file is read until its end is reached, or until an **End** command is reached.

The general layout of the file is:

```
# Input file (this a comment)
<Global modifications and analysis specifications>
Experiment {
  <Specifications for first experiment>
}
Experiment {
  <Specifications for second experiment>
}
# Unlimited number of experiment specifications
End # Optional End statement. Everything after this line is ignored
```

For Markov chain Monte Carlo simulations (see Section 6.3.6 [MCMC() specification], page 30), the general layout of the file includes **Level** definitions:

## 6 Specifying Simulations

After having your model defined and processed by `mod`, and the resulting `model.c` file compiled with the MCSim routines, you are ready to run simulations. For this you need to write a simulation file.

An example file `perc.lsodes.in`, which works with the perchloroethylene model, appears in Appendix (see Section B.4 [`perc.lsodes.in`], page 54).

### 6.1 Using the compiled program

The simulation environment MCSim provides several types of simulations for the models you create. Simulations are specified in a text file of format similar to that of the model description file.

In Unix the command-line syntax for the MCSim program is:

```
mcsim [input-file [output-file]]
```

where the brackets indicate optional arguments. This assume that you have not renamed the executable file; If you have, substitute the name of your executable. If no input and output file names are specified, the program will prompt you for them. If already one file name is given on the command-line, the program will assume it specifies the input file and will prompt you for the output file name. You must provide an input file name. If you just hit the return key when prompted for the output name, the program will use the name you have specified in the input file, if any, or a default name. When the program starts up, it announces which model description file it was created with. The input file describes the simulations to perform and specifies which outputs should be printed out (see Section 6.2 [Syntax of simulation files], page 24).

On the Macintosh you double-click the `MCSim` icon and enter the name of your simulation definition file at the first prompt and then the name of the output file (or just hit return if you want the default or the name you have specified in the input file to be used).



### 5.2.9 Note about models

MCSim can easily deal with algebraic models. You do not need to define state variables or a **Dynamics** section for such models. Simply use input and output variables and parameters. The model can be specified in the **CalcOutputs** section. You can use the time  $\tau$  if that is natural for your model. If you do not use  $\tau$  in your model, you will still need to specify "output times" in **Print()** or **PrintStep()** statements to obtain outputs: you can use an arbitrary time, such as 1. If you do not use  $\tau$  you will also need to define an **Experiment** (see Section 6.4.1 [Experiment definition], page 33) for each combination of values for the "independent" variables of your model. This may be clumsy if many values are to be used. In that case, you may want to use the variable  $\tau$  to represent something else than time.

Ordinary differential models, with algebraic components, can be setup easily with MCSim. Use state variables and specify a **Dynamics** section. Time,  $\tau$  is the integration variable, but here again,  $\tau$  can be used to represent anything you want. We are not aware of cases in which MCSim has been used for partial differential equations. Some problems might be solved by implementing rudimentary line methods...

You can use MCSim for discrete-time dynamic models (or difference models). It's a bit tricky. Assignments in **CalcOutput** are volatile (not memorized), so the model equations have to be in **Dynamics**. But the model variables should still be declared as outputs, because they should not be updated by integration. However, you need at least a true state in the **Dynamics** section, so you should declare a dummy one (and give it a constant derivative of value zero). You also want the calls to **Dynamics** to be precisely scheduled, so it is best to use the **Euler** integration routine (see Section 6.3.2 [Integrate() specification], page 26) which uses a constant step. Since Euler may call repeatedly **Dynamics** at any given time, you want to guard against untimely updating... Altogether, we recommend that you examine the sample files 'discrete.model' and 'discrete.in' provided with the source code for MCSim.

Only variables that have been declared with the keyword **Outputs** can be changed in this section.

Assignments to other types of variables cause an error message like the following to be issued:

```
Error: line 56: 'Qb_fat' used in invalid context.
Only outputs can be defined in CalcOutputs{} section.
```

Any reference to an input or state variable will use the last calculated (current) value of the input. The `dt()` operator can appear in the right-hand side of equations, and it refers to values of the derivative as calculated at the last time step (see Section 5.2.5 [Dynamics specifications], page 18). Like in the **Dynamics** section, the integration variable can be accessed if referred to as `t`, as in:

```
Qx_out = DQx * t;
```

### 5.2.8 Comments on style

For your model file to be readable and understandable, it is useful to use a consistent style of notation. The example file `'perc.model'` follows such a consistent notation (see Section B.3 [perc.model], page 49). For example we suggest that:

- All variable names begin with a capital letter followed by meaningful lower case subscripts.
- Where two subscripts are necessary, they can be separated by an underscore, such as in `'Qb_fat'`.
- Where there is only one subscript an underscore can still be used to increase readability as in `'Q_fat'`.
- Where two words are used in combination to name one item, they can be separated visually by capitalizing each word, as in `'BodyWt'`.

These conventions are suggestions only. The key is to have a consistent notation that makes sense to you. Consistency is one of the best ways to:

1. Increase readability, both for others and for yourself. If you have to suspend work for a month or two and then come back to it, the last thing you want is to have to decipher your own file.
2. Decrease the likelihood of mistakes. If all of the equations are coded with a consistent, logical convention, mistakes stand out more readily.

```
dt(Qm_in) = Qmetabolized - dt(Qm_out);
```

The integration variable (e.g., time) can be accessed if referred to as **t**, as in:

```
dt(Qm_in) = Qmetabolized - t;
```

Output variables can also be made a function of **t** in the **Dynamics** section.

Note that while state variables, input variables and model parameters can indeed be used on the right-hand side of equations, they cannot be assigned values in the **Dynamics** section. If you need a parameter to change with time, declare it as output variable in the global section. Assignments to inputs or parameters in this section causes an error message like the following to be issued:

```
Error: line 48: 'YourParm' used in invalid context.  
Parameters cannot be defined in Dynamics{} section.
```

### 5.2.6 Parameter scaling

The parameter scaling section begins with the keyword *Scale* and is enclosed in curly braces. The equations given in this section will define a function that will be called by the simulation program at the beginning of each simulation of an **Experiment** (see Section 6.4.1 [Experiment definition], page 33). They can therefore be used for initialization of the simulations.

All model variables and parameters can be changed in this section. Modifications to state variables affect initial values only. Modifying an input is not allowed and state variables can only appear at the left hand side of equations.

The **dt()** operator (see Section 5.2.5 [Dynamics specifications], page 18) cannot be used in this section, since derivatives have not yet been computed when the scaling function is called.

### 5.2.7 Output calculations

The output calculation section begins with the keyword *CalcOutputs* and is enclosed in curly braces. The equations given in this section will be called by the simulation program at each output time specified by a **Print()** or **PrintStep()** statement (see Section 6.4.3 [Print() specification], page 34, and see Section 6.4.4 [PrintStep() specification], page 35). In this way, the output scaling is done efficiently, only when values are to be saved, and not at each integration step.



Input functions can be combined to give a lot of flexibility (e.g., an input can be sum of some others). Separate inputs can be declared in the global section of the model definition file and combined in the `Dynamics` and `CalcOutputs` sections. The only limitation is that for each input function used, a separate input must be defined in the model, even though this function may not be a real element of the model.

### 5.2.5 Dynamics specifications

The dynamics specification section begins with the keyword *Dynamics* and is enclosed in curly braces. The equations given in this section will be called by the integrator at each integration step.

Additional variables to those declared in the global section may be used for any calculations within the section. They will be declared as local temporary variables. (Note, for example, the use of `'Cout_fat'` and `'Cout_wp'` in the `'perc.model'` sample file). Local variables are not accessible from the simulation program, or from other sections of the model definition file, so don't try to output them.

Each state variable declared in the global section must have one corresponding state equation in the `Dynamics` section. If a state equation is missing, `mod` issues an error message such as:

```
Error: State variable 'Q_foo' has no dynamics.
```

If one or more differential equations are missing, no program file will be created. Most error messages are self-explanatory. Where appropriate, they also show a line number in the input file where the error occurred. Beware, however, of cascades of errors generated as a consequence of a first one; so don't panic: start by fixing the first one and rerun `mod`.

The derivative of a state variable is defined using the `dt()` operator, as shown here:

```
dt(state-variable) '=' constant-value-or-expression ';' ;'
```

The right-hand side can be any valid C expression, including standard math library calls and the special functions mentioned above (see Section 5.2.3 [Special functions], page 16). Note, however, that no syntactic check is performed on the library function calls. Their correctness is your responsibility.

The `dt()` operator can also be used in the right-hand side of equations in the dynamics section to refer to the value of a derivative at that point in the calculations. For example:

## 5.2.4 Input functions

They can be used in a special assignments, valid only for input variables. Inputs can be initialized as a constant or expression, or assigned one of the following input functions:

- *PerDose()* specifies a periodic input of constant *magnitude*. The input begins at *initial-time* in the *period* and lasts for *exposure-time* time units. Syntax:  

```
PerDose(<magnitude>, <period>, <initial-time>, <exposure-time>);
```
- *PerExp()* specifies a periodic exponential input. At time *initial-time* in the *period* the input rises instantaneously to *magnitude* and begins to decay exponentially with the constant *decay-constant*. The input is turned off once the magnitude reaches a negligible fraction ( $10^{-6}$ ) of its original value. Syntax:  

```
PerExp(<magnitude>, <period>, <initial-time>, <decay-constant>);
```
- *NDoses()* specifies a number of stepwise inputs of variable magnitude and their starting times. The first argument, *n*, is the number of input steps and start times. Next come a list of magnitudes and a list of initial times. Each list is comma-separated. The duration of input step is computed automatically by difference between the specified times. Currently this function can only be used in the simulation description file, and not in the model description file (which simply implies that you cannot use it as a default). Syntax:  

```
NDoses(<n>, <list-of-magnitudes>, <list-of-initial-times>);
```
- *Spikes()* specifies a number of instantaneous inputs of variable magnitude and their exact times of occurrence. The first argument, *n*, is the number of inputs and input times. Next come a list of magnitudes and a list of times. Each list is comma-separated. Currently this function can only be used in the simulation description file, and not in the model description file (which simply implies that you cannot use it as a default). Syntax:  

```
Spikes(<n>, <list-of-magnitudes>, <list-of-times>);
```

The arguments of input functions can either be constants or variables. As an example, if ‘GavMag’ and ‘RateConst’ are defined model parameters, then the input variable ‘Q\_gav’ can be defined as:

```
Q_gav = PerExp(GavMag, 60, 0, RateConst);
```

In this way the parameters of input functions can, for example, be assigned statistical distributions in Monte Carlo simulations (see Section 6.3.5 [Distrib() specification], page 28).

Variable dependencies are resolved before the simulation is started. For each of the periodic functions, a single exposure beginning at time *initial-time* can be specified by giving an effectively infinite period, *e.g.*  $10^{10}$ . The first period starts at the initial time of the simulation. Magnitudes change exactly at the times given.

If a global state, input, or output variable is not given an initial value, it will default to zero. Initial values are reset to their specified value by the simulation program at the start of each simulation of an **Experiment** (see Section 6.4.1 [Experiment definition], page 33).

All the model parameters you want to be able to change through simulation files should be declared global. Parameters must be given nominal values, following the assignment rules given above. For example:

```
BodyWt = 0.38 + sqrt(0.01); # (kg) Weight of the rat
```

All parameters and variables are computed in double precision floating-point numbers. Initialization values should not be such as to cause computation errors in the model equations; this is likely to cause program crashes (so, for example, do not assign a default value of zero to a parameter appearing alone in a denominator). Note that the order of global declarations matters within the global section itself (*i.e.*, parameters and variables should be defined and initialized before being used in assignments of others), but not with respect to other blocks. A parameter defined at the end of the description file can be used in the dynamics section which may appear at the beginning of the file. Still, such an inverse order should be avoided. For this reason, the format above, where global declarations come first, is strongly suggested to avoid confusing results. Note again that the name **IFN**, in capital letters, is reserved by the program and should not be used as parameter or variable name. Finally, if a parameter is defined several times, only the first definition is taken into account.

### 5.2.3 Special functions

The following special functions (whose name is case-sensitive) are available to the user for assignment of parameters and variables in the model definition file:

- *CDFNormal*( $x$ ): the normal cumulative density function;
- *erfc*( $x$ ): the error function;
- *lnDFNormal*( $x$ ,  $mean$ ,  $sd$ ): the natural logarithm of the normal density function;
- *lnGamma*( $x$ ): the natural logarithm of the gamma function;
- *UniformRandom*( $min$ ,  $max$ ): returns a uniformly distributed random variable, sampled between  $min$  and  $max$ . The algorithm used is that of Park and Miller (Barry, 1996; Park and Miller, 1988; Vattulainen et al., 1994) (see [Bibliographic References], page 41). A default random generator seed (314159265.3589793) is used;
- *NormalRandom*( $mean$ ,  $sd$ ): returns a normally distributed random variable. The default random generator seed is used.

erators allowed are the equality operator `==`, and non-equality operators `!=`, `<`, `>`, `<>`, `<=` and `>=`.

## 5.2.2 Global parameter declarations

Commands not specified within the delimiting braces of another section are considered to be global declarations. In the global section, you first declare the states, inputs, and outputs variables. There should be at least one state or output variable in your model.

- States are variables for which a first-order differential equation is defined (higher orders or partial differential equations are not allowed).
- Inputs are variables independent of the others variables, but eventually varying with time (for example an exposure concentration to a chemical).
- Outputs are dependent model variables (obtainable at any time as analytical functions of the states, inputs or parameters) that do not have dynamics.

The format for declaring each of these variables is the same, and consists of the keyword *States*, *Inputs* or *Outputs* followed by a list of the variable names enclosed in curly braces as shown here:

```
States = {Qb_fat, # Benzene in the fat
         Qb_bm,  # ...      in the bone marrow
         Qb_liv}; # ...      in the liver and others

Inputs = {Q_gav, # Gavage dose
         C_inh}; # Inhalation concentration

Outputs = {Cb_exp, # Concentration in expired air
          Cb_ven}; # ...      in venous blood
```

After being defined, states, inputs and outputs can then be given initial values (constants or expressions). Note that inputs can also be assigned input functions, described below. Some examples of initialization are shown here:

```
Qb_fat = 0.1; # Default initial value for state variable Qb_fat

# Gavage input assigned a periodic exponential input function
Q_gav = PerExp(1, 60, 0, 1); # Magnitude of 1.0,
                             # period of 60 time units,
                             # T0 in period is 0,
                             # Rate constant is 1.0
```

```

<Global parameter specifications>
Dynamics {
  <Equations for calculating the dynamics, or state derivatives>
}
Scale {
  <Equations for scaling model parameters>
}
CalcOutputs {
  <Equations for scaling the outputs>
}

```

where *Dynamics*, *Scale* and *CalcOutputs* are keywords and, if used, must appear as shown, followed by the curly braces which delimit the section. At least one of the sections **Dynamics** or **CalcOutputs** should be defined. **Dynamics** must be used if the model includes differential equations.

### 5.2.1 General syntax

The general syntax of the file is as follows:

- Comments begin with a pound sign (#) and continue to the end of the line.
- Blank lines are allowed and ignored.
- All commands can span several lines and are terminated by a semi-colon (;). There should be no blank space before the semi-colon.
- Variable assignments have the following syntax:

```
var-name '=' constant-value-or-expression ';'

```

where var-name is any valid C identifier, starting with a letter or underscore (`_`) and followed by any number of alpha-numeric characters or underscores, up to a maximum of 80. Variable names are case sensitive. Note that the name `IFN`, in capital letters, is reserved by the program and should not be used as parameter or variable name. The equal sign is needed. The right-hand side expression can be a valid C mathematical expression including already defined variables and ANSI C mathematical functions. Additional functions, called special functions, can be used, which take variable names, constant values or expressions as parameters. Special functions are detailed below (see Section 5.2.3 [Special functions], page 16). Finally, there should be no space before the terminating semi-colon.

Colon conditional assignments can also be used. Syntax:

```
var-name '=' (<condition> ? <value-if-true> : <value-if-false>);

```

For example:

```
Adj_Parm = (Input > 0.0 ? Parm * Adjust : Parm);

```

In this example, if 'Input' is greater than 0, the parameter 'Adj\_Parm' is computed as the product of 'Parm' by 'Adjust'; otherwise 'Adj\_Parm' is equal to 'Parm'. The comparison op-

## 5 Defining Models

Three examples of model simulation files: ‘`linear.model`’, ‘`1cpt.model`’ and ‘`perc.model`’ are included with the program files and appears in Appendix of this manual (see Appendix B [Examples], page 47).

### 5.1 Using Mod to process model description files

The `mod` program is a stand-alone facility. It takes a model description file in the "user-friendly" format described below and creates a C language file ‘`model.c`’ which you will compile and link to the simulation program. `Mod` allows the user to define equations for the model, assign default values to parameters or default initial values to model variables, and define scaling functions for both the input parameters and the outputs variables. `Mod` lets the user create and modify models without having to maintain C code.

In Unix, the command line syntax for the `mod` program is:

```
mod [input-file [output-file]]
```

where the brackets indicate that the input and output filenames are optional. If the input filename is not specified, the program will prompt for both. If only the input filename is specified, the output is written by default to the file ‘`model.c`’. Unless you feel like doing some makefile programming, we recommend using this default since the makefile for MCSim assumes the C language model file to have this name. You have to have prepared an input file containing a description of the model following the syntax described in the following (see Section 5.2 [Syntax of mod files], page 13).

On the Macintosh you double-click the ‘`Mod`’ icon and enter the name of the model definition file at the prompt (on the Macintosh, names can include space characters).

### 5.2 Syntax of the model description file

The model description file is a text (ASCII) file that consists of several sections, including global declarations, dynamics specifications (eventually with derivative calculations), model scaling, and output computations:

```
# Model description file (this is a comment)
```

To start `mod` under Unix just type `mod perc.model`. On a Macintosh, double click the 'Mod' icon; `Mod` prompts you for the name of your model definition file; Type '`perc.model`'. After a few seconds, with no error messages if the model definition is syntactically correct, `Mod` announces that the '`model.c`' file has been generated. On a Macintosh you need to hit the return key to exit `Mod`.

The next step is to compile and link together the various C files that will constitute the simulation program for your particular model. Note that each time you want to change an equation in your model you will have to change the model definition file and repeat the steps above. However, changing just parameter values or state initial values does not require recompilation since that can be done through simulation specification files.

- Under Unix, the simplest is to use the `make` utility. Just type `make` and compilation will be done automatically (see Appendix A [Using make], page 45). An executable '`mcsim`' is created. You can rename it to better describe the fact that it is model specific: rename it '`mcsim_perc`', for example.
- On a Macintosh, or PC, the best is to use a Think C project or a similar programming environment. You should first use the command `make` or its equivalent to compile the modified '`model.c`' file and other C files. Then create an application (you should give it a name specific to the model you are developing, e.g., '`MCSim Perc`'). Refer to your compiler manual for details on how to use your programming environment. Your executable '`MCSim Perc`' program is now ready to perform simulations.

To start your MCSim program just type `mcsim_perc` (if you gave it that name) under Unix, or double click the '`MCSim Perc`' or whatever name you specified icon on your Macintosh. After an introductory banner (telling in particular which model file the program has been compiled with), you are prompted for an input file name: type `perc.lsodes.in` (see Section B.4 [`perc.lsodes.in`], page 54, to see this file now). The program then prompts you for the output file name: type `perc.lsodes.out`. After a few seconds or less (depending on your machine) the program announces that it has finished and that the output file is '`perc.lsodes.out`' (on a Macintosh you should hit the return key to exit the program completely). You can open the output file with any text editor or word processor, you can edit it for input in graphic programs etc.

Several other models and simulation specification files are provided with the package as examples (they are in the '`sim`' directory. Try them and observe the output you obtain. You can then start programming you own models and doing simulations. The next sections of this manual reference the syntax for model definition and simulation specifications.

## 4 Working Through an Example

Pharmacokinetics models describe the transport and transformation of chemical compounds in the body. These models often include nonlinear first-order differential equations. The following example is taken from our own work on the kinetics of tetrachloroethylene (a solvent) in the human body (Bois et al., 1996; Bois et al., 1990) (see [Bibliographic References], page 41). Go to the ‘sim’ directory (under Unix) or to the ‘Development’ folder (on a Macintosh). Open the file ‘perc.model’ with any text editor (e.g., `emacs` or `vi` under Unix). This file is distributed as an example of a model definition file (see Section B.3 [perc.model], page 49). You can use it as a template for your own model, but you should leave it unchanged for now. Notice that it defines:

- state variables for the model (for which differentials are defined), for example:

```
States = {Q_fat,      # Quantity of PERC in the fat
          Q_wp,      # ... in the well-perfused compartment
          Q_pp,      # ... in the poorly-perfused compartment
          Q_liv,     # ... in the liver
          Q_exh,     # ... exhaled
          Qmet}      # Quantity of metabolite formed
```

- output variables (obtainable at any time as analytical functions of the states, inputs and parameters), for example:

```
Outputs = {C_liv,    # mg/l in the liver
           C_alv,    # ... in the alveolar air
           C_exh,    # ... in the exhaled air
           C_ven,    # ... in the venous blood
           Pct_metabolized, # % of the dose metabolized
           C_exh_ug} # ug/l in the exhaled air
```

- input variables (independent of the others variables, and eventually varying with time), for example:

```
Inputs = {C_inh} # Concentration inhaled
```

- model parameters (independent of time), such as:

```
LeanBodyWt = 55; # lean body weight
```

- system’s dynamics (differential or algebraic equations defining the model *per se*),
- parameters’ scaling (the parameters used in the equations can be made functions of other parameters: for example volumes can be computed from masses and densities),
- equations to compute the output variables.

This model definition file as a simple syntax, easy to master. It needs to be turned into a C program file before compilation and linking to the other routines (integration, file management etc.) of MCSim. You will use `mod` for that. First, quit the editor and return to the operating system.



of this manual (see Chapter 4 [Working Through an Example], page 11, which walk you through an example of model building and running.

The makefile `'Test_mcsim'` can be used to test whether the program output on your Unix machine is the same as the one on our machines. Just type: `make; make -f Test_mcsim` when in your `'sim'` directory. All input files will be run and their output compared to the corresponding output files. You will need to have the `'mod'` program already compiled and inside the `'sim'` directory, or on the command path. In case of differences, don't panic: check the actual differences between the culprit output file and the file `'sim.out'` produced by the makefile. Small differences may occur from different machine precision. This can happen for random numbers, in which case the Markov chain simulations (MCMC) can diverge greatly after a while.

## 3 Installation

### 3.1 System requirements

MCSim is written in ANSI-standard C language. We are distributing the source code and you should be able to compile it for any system, provided you have an ANSI C compiler. On a Unix system we recommend that you install the GNU `gcc` compiler (freeware) and the `make` utility (which is in fact standard on most systems). For PC-type computers we recommend the Unix operating system Linux. For the Macintosh, you can use version 8.0 (or higher) of Symantecs Think C compiler, although other compilers should work.

### 3.2 Distribution

MCSim source code is available on Internet through '<ftp://sparky.berkeley.edu/pub/mcsim>', '<http://sparky.berkeley.edu/users/fbois/>', and '<http://www.gnu.ai.mit.edu/home.html>'.

### 3.3 Machine-Specific Installation

To install on a given machine, download (in binary mode) the distributed archive file to your machine.directory. Move it to an empty directory of any name. Decompress the archive with GNU `gunzip` (`gunzip <archive-name.gz>`). Untar the decompressed archive with `tar` (`tar xf <archive-name>`; do `man tar` for further help). On Macintosh machines the programme "Stuffit Expander" should be able to both uncompress and untar the archive. This decompression will create two directories: '`mod`' and '`sim`'.

Move to the '`mod`' directory. Under Unix, compile the `mod` program using the '`Makefile`' in that directory (the command `make` should just do that). Under other operating systems, refer to the documentation of your compiler to create an executable '`mod`' file from the source code provided in the '`mod`' directory. Move the executable '`mod`' program you just created to the '`sim`' directory.

You are then ready to use MCSim. This requires creating a model definition file, processing it with the `mod` program, and compiling the resulting '`model.c`' file with all the other C files in the '`sim`' directory. You can then run simulations files. We recommend that you go to the next section

## 2.2 Types of simulations

Four types of simulations are available:

- A *DefaultSim* simulation will simply solve (eventually integrate) the equations you specified, using the default parameter values and possible overrides imposed in a simulation specification file. User-requested outputs are sent to an output file (see Section 6.3.1 [SimType() specification], page 25).
- A *MonteCarlo* simulation will perform repeated (stochastic) simulations across a randomly sampled region of the model parameter space (see Section 6.3.4 [MonteCarlo() specification], page 27).
- A *MCMC* simulation performs a series of simulations along a Markov chain in the model parameter space (see Section 6.3.6 [MCMC() specification], page 30). These are Monte Carlo simulations in which the choice of a new parameter value is influenced by the current value. They can be used to obtain the Bayesian posterior distribution of the model parameters, given their prior distributions (that you specify) and data for which a likelihood function can be computed. The program handles hierarchical (random effect) statistical models, such as population pharmacokinetic models (see Section 6.5.1 [Specifying a statistical model], page 38).
- A *SetPoints* simulation solves the model for a series of specified parameter sets, listed in a separate ASCII file (see Section 6.3.7 [SetPoints() specification], page 32). You can create these parameter sets yourself or use the output of a previous Monte Carlo or MCMC simulation.

## 2.3 Major changes introduced with version 4.2.0

- A new input function, *Spikes()* is available. It simulates instantaneous inputs (see Section 5.2.4 [Input functions], page 17).
- Six new distributions are available for Monte Carlo simulations: *InvGamma* (inverse-gamma), *Piecewise*, *NormalLv*, *LogNormalLv*, *TruncNormalLv*, *TruncLogNormalLv* (see Section 6.3.5 [Distrib() specification], page 28).
- In Monte Carlo simulations, shape parameters of `Distrib()` statements can now reference other sampled parameters (see Section 6.3.4 [MonteCarlo() specification], page 27).
- A *simTypeFlag* option, in the `MCMC()` specification, allows the printing of times, data and predictions for easy checking of the model fit. It can also be set to switch MCMC sampling from component by component sampling to vector sampling (see Section 6.3.6 [MCMC() specification], page 30).

## 2 Overview

MCSim consists of two pieces, a model generator and a simulation engine. The model generator, *mod*, was created to facilitate the model maintenance and simulation definition, while keeping execution time fast. Other programs have been created to the same end, the Matlab family of graphical interactive programs being some of the more general and easy to use. Still, many available tools are not optimal for performing time and computer intensive Monte Carlo analyses. MCSim was created specifically to this end: to perform Monte Carlo analyses in a highly optimized, and easy to maintain environment.

### 2.1 General procedure

Model building and simulation proceeds in four stages:

1. You create with any text editor a model description file. The reference section on **mod**, later in this manual gives you the syntax to use (see Chapter 5 [Defining Models], page 13). This syntax allows you to describe the model variables, parameters, equations, inputs and outputs in a C-like fashion without having you to actually know how to write a C program.
2. You instruct the model generator, **mod**, to preprocess your model description file. **Mod** creates a C file, called '**model.c**'.
3. You compile and link the newly created '**model.c**' file together with the other C program files. MCSim C code is standard, so you should be able to compile it with any standard C compiler, for example GNU **gcc**. After compiling and linking, an executable simulation program '**mcsim**' is created, specific of the particular model you have designed. These preprocessing and compilation steps may seem clumsy but they produce the most efficient code for your particular machine.
4. You design any number of simulation specification files and run them with the **mcsim** program. The simulation specification files describe the kind of simulation to run (simple simulations, Monte Carlo etc.), various settings for the integration algorithm if needed, and a description of one or several experimental conditions or observations to simulate (see Chapter 6 [Specifying Simulations], page 23). The simulation output is written to standard ASCII files.

Little or no knowledge of computer programming is required, unless you want to tailor the program to special needs, beyond what is described in this manual (in which case you should contact us). You need, however, some familiarity with program compilation under your operating system (see Section 3.3 [System requirements], page 9). The software manual for your compiler should be able to help you.

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*MCSim:*

A Monte Carlo Simulation Program

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User's Manual