

*Title:* MONTE CARLO PARAMETER STUDIES  
AND UNCERTAINTY ANALYSIS WITH MCNP5

*Author(s):* FORREST B. BROWN, JEREMY E. SWEEZY,  
& ROBERT B. HAYES

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# Monte Carlo Parameter Studies & Uncertainty Analyses With MCNP5

**Forrest B. Brown, Jeremy E. Sweezy**

X-5, Los Alamos National Laboratory

`fbrown@lanl.gov`, `jsweezy@lanl.gov`

**Robert Hayes**

Radiological Technology, WIPP

`robert.hayes@wipp.ws`

# Monte Carlo Parameter Studies & Uncertainty Analyses with MCNP5

**Forrest B. Brown, Jeremy E. Sweezy (LANL), & Robert Hayes (WIPP)**

A software tool called *mcnp\_pstudy* has been developed to automate the setup, execution, and collection of results from a series of MCNP5 Monte Carlo calculations. This tool provides a convenient means of performing parameter studies, total uncertainty analyses, parallel job execution on clusters, stochastic geometry modeling, and other types of calculations where a series of MCNP5 jobs must be performed with varying problem input specifications.

- Introduction
- mcnp\_pstudy
- Examples
- Usage
  - Parameter definition
  - Parameter expansion
  - Constraints
  - Case setup & execution
  - Collecting & combining results
- Statistics
- Examples

## How are calculated results affected by:

- **Nominal dimensions**
  - With minimum & maximum values ?
  - With as-built tolerances ?
  - With uncertainties ?
- **Material densities**
  - With uncertainties ?
- **Data issues**
  - Different cross-section sets ?
- **Stochastic materials**
  - Distribution of materials ?

**Monte Carlo perturbation theory can handle the case of independent variations in material density, but does not apply to other cases.**

## Brute force approach:

**Run many independent Monte Carlo calculations, varying the input parameters.**

- To simplify & streamline the setup, running, & analysis of Monte Carlo parameter studies & total uncertainty analyses, a new tool has been developed: **mcnp\_pstudy**
- **Control directives are inserted into a standard MCNP input file**
  - Define **lists** of parameters to be substituted into the input file
  - Define parameters to be **sampled from distributions** & then substituted
  - Define **arbitrary relations between parameters**
  - Specify **constraints** on parameters, even in terms of other parameters
  - Specify **repetitions** of calculations
  - Combine parameters as **outer-product for parameter studies**
  - Combine parameters as **inner-product for total uncertainty analysis**
- **Sets up separate calculations**
- **Submits or runs all jobs**
- **Collects results**

- **Completely automates the setup/running/collection for parameter studies & total uncertainty analyses**
  - Painless for users
  - 1 input file & run command can spawn 100s or 1000s of jobs
  - Fast & easy way to become the #1 user on a system  
(Added bonus: make lots of new friends in computer ops & program management.)
- **Ideal for Linux clusters & parallel ASC computers:**
  - Can run many independent concurrent jobs, serial or parallel
  - Faster turnaround: Easier to get many single-cpu jobs through the queues, rather than wait for scheduling a big parallel job
  - Clusters always have some idle nodes

- **mcnp\_pstudy is written in *perl***
  - 640 lines of perl (plus 210 lines of comments)
  - Would have taken many thousands of lines of Fortran or C
- **Portable to any computer system**
  - Tested on Unix, Linux, Mac OS X, Windows
  - For Windows PCs, need to execute under the Cygwin shell
- **Can be modified easily if needed**
  - To add extra features
  - To accommodate local computer configuration
    - Node naming conventions for parallel cluster
    - Batch queueing system for cluster
    - Names & configuration of disk file systems (ie, local or shared)
    - Location of MCNP5 and MCNP5.mpi



## MCNP input for simple Godiva calculation

```
gdv
1  -18.74  -1  imp:n=1
2      0      1  imp:n=0

1      so 8.741

kcode 10000  1.0  15  115
ksrc  0 0 0
m1      92235 -94.73      92238 -5.27
prdmp 0 0 1 1 0
```

## MCNP input using *mcnp\_pstudy*, Run 50 different cases - Each with a distinct (odd) random seed

```
gdv-A
C @@@  RNSEED = ( 2*int(rand(1000000))+1 )
C @@@  xxx      = REPEAT 50
1  -18.74  -1  imp:n=1
2      0      1  imp:n=0

1      so 8.741

kcode 10000  1.0  15  115
ksrc  0 0 0
m1      92235 -94.73      92238 -5.27
prdmp 0 0 1 1 0
rand  seed=RNSEED
```

- Within an MCNP input file, all directives to mcnp\_pstudy must begin with

**C    @@@**

- To continue a line, use "\" as the last character

**C    @@@    XXX = 1    2    3    4    5    6    \**  
**C    @@@                    7    8    9    10**

- Parameter definitions have the form

**C    @@@    P =    *value or list***  
**C    @@@    P = ( *arithmetic-expression* )**

- Constraints have the form

**C    @@@    CONSTRAINT = ( *expression* )**

- Control directives have the form

**C    @@@    OPTIONS =    *list-of-options***

- Parameters

- Like C or Fortran variables
- Start with a letter, contain only letters, integers, underscore
- Case sensitive
- Parameters are assigned values, either number(s) or string(s)
- Examples: **R1, r1, U\_density, U\_den**

- Single value

**C   @@@   P1   =   value**

- List of values

**C   @@@   P2   =   value1   value2   ...   valueN**

- List of N random samples from a Normal probability density

**C   @@@   P3   =   normal   N   ave   dev**

- List of N random samples from a Uniform probability density

**C   @@@   P4   =   uniform   N   min   max**

- Arithmetic expression

```
C   @@@   P5   = (  arithmetic-statement  )
```

- Can use numbers & previously defined parameters
- Can use arithmetic operators **+**, **-**, **\***, **/**, **%** (mod), **\*\*** (exponentiation)
- Can use parentheses **( )**
- Can use functions: **sin()**, **cos()**, **log()**, **log10()**, **exp()**, **int()**, **abs()**, **sqrt()**
- Can generate random number in (0,N): **rand(N)**
- Must evaluate to a single number
- Examples:

```
C   @@@   FACT   = normal 1   1.0 .05
```

```
C   @@@   UDEN   = ( 18.74 * FACT )
```

```
C   @@@   URAD   = ( 8.741 * (18.74/UDEN)**.333333 )
```

- Repetition (list of integers, 1..N)

```
C   @@@   P6   = repeat  N
```

- Examples

```
C  rod height in inches, for search
```

```
C  @@@  HROD = 5   10   15   20   25   30   35   40   45   50
```

```
C  nominal dimension, with uncertainty
```

```
C  @@@  X1 = normal  25    1.234   .002
```

```
C  dimension, with min & max
```

```
C  @@@  X2 = uniform 25    1.232   1.236
```

```
C  try different cross-sections
```

```
C  @@@  U235 = 92235.42c  92235.49c  92235.52c  \
```

```
C  @@@           92235.60c  92235.66c
```

```
C  different random number seeds (odd)
```

```
C  @@@  SEED = ( 2*int(rand(1000000)) + 1 )
```

### Random Sampling of Parameters

- For parameters sampled from a **Uniform** probability density, each sample is obtained as

$$P = xmin + (xmax-xmin)*rand()$$

- For parameters sampled from a **Normal** probability density, each sample is obtained using the Box-Muller scheme

$$P = ave + dev * \sqrt{-2*\log(rand())} * \sin(2*\pi*rand())$$

- Other probability densities could easily be added

### Arithmetic Expressions & Constraints

- Evaluated within **perl**, using the **eval** function
- Must conform to **perl** rules for arithmetic

## Parameter Expansion

- After all parameters are defined, **mcnp\_pstudy** expands them into sets to be used for each separate MCNP calculation
  - Outer product expansion: All possible combinations.  
Parameters specified first vary fastest.
  - Inner product expansion: Corresponding parameters in sequence.  
If not enough entries, last is repeated.

Example:

```
c @@@ A = 1 2
c @@@ B = 3 4
c @@@ C = 5
```

**Outer:**

```
Case 1:      A=1,      B=3,      C=5
Case 2:      A=2,      B=3,      C=5
Case 3:      A=1,      B=4,      C=5
Case 4:      A=2,      B=4,      C=5
```

**Inner:**

```
Case 1:      A=1,      B=3,      C=5
Case 2:      A=2,      B=4,      C=5
```

## Constraint Conditions

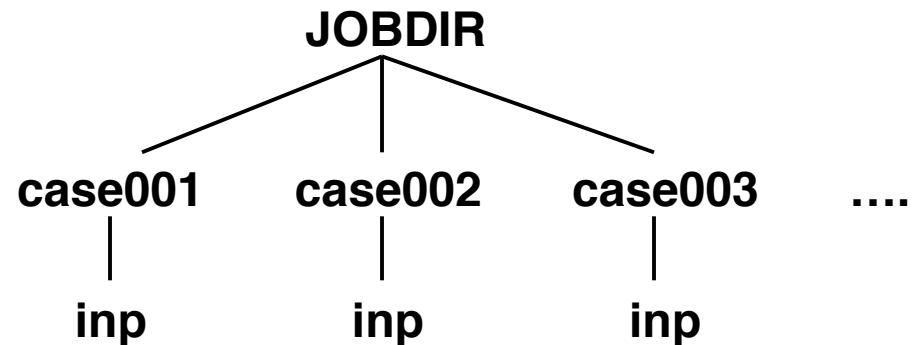
- After all parameters are defined & expanded, constraint conditions are evaluated
- Constraints involve comparison operators ( >, <, >=, <=, ==, != ) or logical operators ( && (and), || (or), ! (not) ), and may involve arithmetic or functions
- Constraints must evaluate to True or False
- If a any constraint is not met, the parameters for that case are discarded & re-evaluated until all of the constraints are satisfied

### Example

```
C pick a random direction
C @@@ ANGLE = ( 6.2831853 * rand(1) )
C @@@ UUU   = ( cos(ANGLE) )
C @@@ VVV   = ( sin(ANGLE) )
C
C same, using CONSTRAINT to implement rejection scheme
c @@@ RN1 = ( 2.*rand(1) - 1. )
C @@@ RN2 = ( 2.*rand(1) - 1. )
C @@@ CONSTRAINT = ( RN1**2 + RN2**2 < 1.0 )
C @@@ UUU = ( RN1 / sqrt(RN1**2 + RN2**2) )
C @@@ VVV = ( RN2 / sqrt(RN1**2 + RN2**2) )
```



- Directory structure for MCNP5 jobs



- Unix filesystem conventions followed

**JOBDIR/case001/inp, JOBDIR/case002/inp, etc.**

- Values of parameters are substituted into the original MCNP5 input file to create the input files for each case

- Parameters substituted only when exact matches are found
  - Example: **UDEN** matches **UDEN**, and not **UDEN1**, **UDENS**, **uden**

- **Specifying options for running jobs**

- Can be specified on the **mcnp\_pstudy** command-line

```
mcnp_pstudy -inner -setup -i inp01
```

- Within the INP file

```
c @@@ OPTIONS = -inner
```

- **Common options**

<b>-i str</b>	The INP filename is <i>str</i> , default = inp
<b>-jobdir str</b>	Use <i>str</i> as the name of the job directory
<b>-case str</b>	Use <i>str</i> as the name for case directories
<b>-mcnp_opts str</b>	Append <i>str</i> to the MCNP5 run command, may be a string such as 'o=outx tasks 4'
<b>-bsub_opts str</b>	<i>str</i> is appended to the LSF bsub command
<b>-inner</b>	Inner product approach to case parameter substitution
<b>-outer</b>	Outer product approach to case parameter substitution
<b>-setup</b>	Create the cases & INP files for each
<b>-run</b>	Run the MCNP5 jobs on this computer
<b>-submit</b>	Submit the MCNP5 jobs using LSF bsub command
<b>-collect</b>	Collect results from the MCNP5 jobs

## Running or Submitting Jobs

- Jobs can be run on the current system, or can be submitted to a batch queueing system (e.g., LSF)
- Tally results & K-effective can be collected when jobs finish

Examples:

```
bash:  mcnp_pstudy -inner -i inp01 -setup
```

```
bash:  mcnp_pstudy -inner -i inp01 -run
```

```
bash:  mcnp_pstudy -inner -i inp01 -collect
```

```
bash:  mcnp_pstudy -inner -i inp01 -setup -run -collect
```

```
bash:  mcnp_pstudy -inner -i inp01 -setup -submit
```

```
... wait till all jobs complete...
```

```
bash:  mcnp_pstudy -inner -i inp01 -collect
```

- Tally results & K-effective from separate cases can be combined using batch statistics:

$$\bar{X} = \frac{1}{M} \cdot \sum_{k=1}^M X_k \quad \sigma_{\bar{X}} = \sqrt{\frac{1}{M-1} \cdot \left[ \frac{1}{M} \sum_{k=1}^M X_k^2 - \bar{X}^2 \right]}$$

where **M** is the number of cases & **X<sub>k</sub>** is some tally or Keff for case **k**

- Variance due to randomness in histories decreases as 1/M, but variance due to randomness in input parameters is constant

$$\sigma_{\bar{X}}^2 \approx \sigma_{\bar{X}, \text{ Monte Carlo}}^2 + \sigma_{\bar{X}, \text{ Initial Conditions}}^2$$

**Varies as 1/M**

**~ Constant**

## Examples

**Vary the fuel density randomly  
& adjust radius for constant mass,  
for 50 cases**

```
gdv-D
c vary fuel density - normal, 5%sd,
c adjust the radius to keep constant mass
c
c @@@ FACT= normal 50 1.0 .05
c @@@ UDEN= ( 18.74*FACT )
c @@@ URAD= ( 8.741*(18.74/UDEN)**.333333 )
c
1      1  -UDEN      -1      imp:n=1
2      0              1      imp:n=0

1      so  URAD

kcode 10000 1.0 15 115
ksrc 0. 0. 0.
m1 92235 -94.73 92238 -5.27
prdmp 0 0 1 1 0
```

**Vary fuel density & mass  
independently, for 50 cases**

```
gdv-E
c vary fuel radius - normal, 5%sd
c vary fuel density- normal, 5%sd
c
c @@@ OPTIONS = -inner
c
c @@@ DFACT = normal 50 1.0 .05
c @@@ UDEN = ( DFACT * 18.74 )
c
c @@@ UFACT = normal 50 1.0 .05
c @@@ URAD = ( UFACT * 8.741 )
c
1      1  -UDEN      -1      imp:n=1
2      0              1      imp:n=0

1      so  URAD

kcode 10000 1.0 15 115
ksrc 0. 0. 0.
m1 92235 -94.73 92238 -5.27
prdmp 0 0 1 1 0
```

**Table 1. Results from varying parameters in the Godiva problem**

Problem	Description	K-effective	$\sigma_{K-eff}$
base	<b>Base case</b> , discard 15 initial cycles, retain 100 cycles with 10K histories/cycle, <b>1M total histories</b>	0.9970	<b>0.0005</b>
A	Repeat the base problem 50 times, <b>50M total histories</b>	0.9972	<b>0.0001</b>
B	<b>Vary the fuel density only</b> : sample from a normal distribution with 5% std.dev, <b>50M total histories</b>	0.9961	<b>0.0061</b>
C	<b>Vary the fuel radius only</b> : sample from a normal distribution with 5% std.dev, <b>50M total histories</b>	1.0057	<b>0.0051</b>
D	<b>Vary the enrichment only</b> , sample from a normal distribution with 5% std.dev, <b>50M total histories</b>	0.9890	<b>0.0027</b>
E	<b>Sample the fuel density from a normal distribution with 5% std.dev, and adjust the fuel radius to keep constant fuel mass, 50M total histories</b>	0.9966	<b>0.0042</b>
F	<b>Sample the fuel density from a normal distribution with 5% std.dev, and independently sample the radius from a normal distribution with 5% std.dev, 50M total histories</b>	1.0073	<b>0.0076</b>

- **Parameter studies**

- Run a series of cases with different control rod positions
- Run a series of cases with different soluble boron concentrations
- Run a series of cases sampling certain dimensions from a Uniform or Normal probability density
- Run a series of cases substituting different versions of a cross-section

- **Total uncertainty analysis**

- Run a series of cases varying all input parameters according to their uncertainties

- **Parallel processing using a "parallel jobs" approach**

- Running N separate jobs with 1 cpu each will be more efficient than running 1 job with N cpus
- Eliminates queue waiting times while cpus are reserved
- Take advantage of cheap Linux clusters

- **Simulation of stochastic geometry**

- Run a series of cases with portions of geometry sampled randomly, with a different realization in each case

- **mcnp\_pstudy works**
  - In use regularly at LANL for a variety of real applications
  - Developed on Mac & PC, runs anywhere
  - Easy to customize, if you have special needs
- **To get it:**
  - MCNP5 website: **[www-xdiv.lanl.gov/x5/MCNP](http://www-xdiv.lanl.gov/x5/MCNP)**

FB Brown, JE Sweezy, RB Hayes, "Monte Carlo Parameter Studies and Uncertainty Analyses with MCNP5", PHYSOR-2004, Chicago, IL (April, 2004)