

#### LA-UR-19-20984

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Title:	Automated Acceleration & Convergence Testing for Monte Carlo Criticality Calculations
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Intended for:	DOE NCSP Technical Program Review, 2019-03-26/2019-03-27 (Amarillo, Texas, United States)
Issued:	2019-02-06

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US DOE Nuclear Criticality Safety Program

Technical Program Review

Pantex, Amarillo TX

26-27 March, 2019





# Automated Acceleration & Convergence Testing for Monte Carlo Criticality Calculations

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## **MC Criticality Calculations - Concerns**



Keff<sup>(n)</sup> Bias Undersampling? Tallies Iteration, n

- Bias in Keff
  - ~ -1 / (neutrons/cycle)

### Bias in source shape

Too low in high-importance regions, Too high in low-importance regions

- Undersampling/clustering Not enough neutrons/cycle to cover space
- Convergence

source shape takes longer than keff

#### Best Practices

Source in all fissile regions. Examine H<sub>src</sub> plot for convergence. >10k neuts/cycle (>100k big probs). A few 100 cycles.

## LANL R&D for MC Criticality Calculations



This work: Combine & automate the red boxes

#### Automated acceleration & convergence testing for MC criticality

- Enabling technology advancements, combined new methods
  - Fission-matrix with adaptive sparse storage
    - Reference solution for fission neutron distribution
    - Used to accelerate convergence of neutron distribution
    - Used in statistical tests for convergence & population size
  - Statistical tests for convergence of neutron distribution
    - 8 tests on metrics, 3 tests on distributions
    - Automatically begin active cycles & tallies
  - Population size tests
- Eliminates the need to run trial calculations, examine Shannon entropy plots, set parameters on KCODE card, & then rerun
  - Provides quantitative evidence of convergence
  - Enables parameter studies & coupled TH feedback
  - Saves significant computer time

## **Automated Methods**

#### Meshing for convergence tests

- Automatically created & extended if needed, no user input required
- Uniform mesh spacing in x,y,z =  $L_{fiss}$  = RMS-distance-to-fission
- Used for sources, entropy, fission matrix:  $S_{neut}$ ,  $H_{src}$ ,  $F(I \leftarrow J)$ ,  $S_{FM}$

#### Cycle 1

- Estimate L<sub>fiss</sub> & set initial mesh
- Initial cycles
  - Iterate until  $S_{neut}$  & F tallies stabilize
  - Automated, test that ( $\Delta$  nonzero tallies) < 2%, 5%

#### • For blocks of cycles (default = 10)

- At end, solve F matrix equations for  $S_{FM}$
- Convergence tests
  - 9 statistical tests must all pass for convergence (also 2 other tests)
- If not converged, accelerate source convergence by importance sampling, weights:  $S_{FM}(m) / S_{neut}(m)$ , m = bin
- If converged, set active cycles to begin with next cycle, perform tests on population size

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## Statistical tests for convergence – Metric Tests

#### Slope test

- For a block of cycles (default = 10)
- For some MC result x from each cycle in block, compute least-squares slope &  $\sigma_{slope}$
- If  $abs(slope(x)) < 0.0001 \rightarrow pass test$ ,  $slope \sim 0$
- If  $abs(slope(x)) < 2 \sigma_{slope} \rightarrow pass test$ ,  $slope \sim 0$  within statistics

#### Metric tests, at end of block for convergence testing

- 1. Slope test for K<sub>tracklen</sub>
- 2. Slope test for K<sub>collide</sub>
- 3. Slope test for K<sub>absorb</sub>
- 4. Slope test for H, Shannon entropy of source distribution
- 5. Slope test for H<sub>X</sub>, Shannon entropy of X marginal source distribution
- 6. Slope test for H<sub>Y</sub>, Shannon entropy of Y marginal source distribution
- 7. Slope test for H<sub>z</sub>, Shannon entropy of Z marginal source distribution
- 8.  $H_{block}$  within 1% of  $H_{FM}$

#### Note: If Test 8 passes, provides more evidence of convergence If Test 8 fails, ignore it – might be due to low popsize



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## **Statistical tests for convergence – Distribution Tests**

#### **Distribution tests**, at end of block for convergence testing

9. Kolmogorov-Smirnov test passed at 95% level,  $S_{\rm block}\ \&\ S_{\rm FM}$  have same distribution

For multi-D distributions, KS statistic depends on ordering. Take worst case KS statistic for many random permutations.

- 10. Chi-square 2-point test passed at 95% level,  $S_{block}$  &  $S_{FM}$  have same distribution
- 11. Relative entropy (Kullback-Liebler discrepancy) test passed at 95% level for S<sub>block</sub> & S<sub>FM</sub>
  - Note: If Test 11 passes, provides more evidence of convergence If Test 11 fails, ignore it – might be due to low popsize

## Statistical tests for convergence

- Convergence tests at end of a block of cycles:
  - Perform Metric tests 1-8
  - Perform Distribution tests 9-11
  - If metric tests 1-7 and distribution tests 9-10 all pass, declare convergence
  - If metric test 8 passes, additional evidence. If not, ignore it.
  - If distribution test 11 passes, additional evidence. If not, ignore it.
- If convergence tests all pass, convergence is locked-in for the remainder of the calculation
  - Tests continue for each block
  - Some tests may occasionally fail (due to statistics, it happens), but convergence is not rescinded

## **Accelerating Source Convergence**

#### fmataccel option

- At the end of each cycle
  - S<sub>FM</sub> is available source from fission matrix at end-of-block
  - S<sub>neuts</sub> is available actual neutron source at end-of-cycle
- During inactive cycles, can optionally use ( $S_{FM}/S_{neuts}$ ) for importance sampling of the fission source
  - Recomputed each cycle using  $~~S_{FM}$  from previous end-of-block, and  $~~S_{neuts}$  for current end-of-cycle
  - Works typically reduces inactive cycles by 2-10 X
  - Effectiveness depends on:
    - Large neuts/cycle &/or not-too-fine mesh for fission matrix
    - Not effective if  $(S_{FM} / S_{neuts})$  has too much statistical noise
  - Further development under consideration:
    - Investigate using  $S_{FM}^{adjoint}$  for source importance sampling
    - Maybe coarsen the fission matrix, to get less statistical noise

## **Statistical tests for Population Size**

Performed after convergence, at end of each block of cycles

- 1. Relative entropy < 0.05 for  $S_{block}$  vs  $S_{FM}$
- 2.  $< H_{cycle} >$  within 1% of  $H_{FM}$

#### If both tests pass, population size is adequate

If either test fails, it is likely that larger neutrons/cycle should be used. A warning message is printed.

For future work, if the popsize tests fail, neutrons/cycle could be automatically increased. That could create resource issues – memory size, run time, etc.

comment. comment. comment. entropy of the fission source distribution will be computed comment. comment. the mesh for source entropy is based on the site coordinates comment. using 3675 mesh cells with spacing approx 1.00\*rms-fiss-dist comment. 35 35 3 Xmin= -1.6861E+02 Ymin= -1.6856E+02 Zmin= -9.6460E+00 Xmax= 1.6856E+02 Ymax= 1.6857E+02 Zmax= 9.9571E+00 comment. Xbins= Ybins= 3 Zbins= comment. comment. comment. comment. the mesh will be automatically extended if necessary to encompass the comment. entire fission distribution, preserving the original mesh spacing. comment. -----comment. comment. comment. -comment. FISSION MATRIX WILL BE COMPUTED to estimate dominance ratio, comment. based on fission sites only - not flights or collisions comment. The mesh for the fission matrix is the same as the entropy mesh, using 3675 mesh bins for tallying fission neutrons comment. comment. comment. Fission matrix mesh will be extended if comment. comment. any fission sites are found outside this mesh. comment. comment. Fission matrix tallies will be reset after cycle Fission matrix eigenfunction will be found every 10 cycles. comment. comment. Fission matrix dimensions: 3675 x 3675 comment. comment. Compressed-row-storage is used for the fission matrix. max number of nonzero entries: 13505625 comment. comment. comment. comment. comment. FMATCONVRG option is being used. Statistical tests on the neutron and fission-matrix distributions will be used to determine convergence and begin active cycles. comment. comment. The 3rd entry on the KCODE card may be ignored. comment. comment. Targets for statistical tests: h slope: < 0.0001 or <2.0 sig, h diff: 0.01 k\_slope: < 0.0001 or <2.0 sig, distribs: 0.95 conf level</pre> comment. comment. comment. comment. comment. FMATACCEL option is being used. The fission matrix will be used to ACCELERATE source convergence comment. comment. of the neutron distribution during inactive cycles. Importance-factor-limits: min= 0.20, max= 5.00 comment. comment. comment. comment. comment.

cycle 1	k(col) 1.35733	ctm 0.04	entropy 0.60521	active	k(c	col)	std dev	chains 35416	
2	1.16857	0.10	0.62080	extend	H-mesh	to:	36 x 35 x 4	22433	
3	1.08223	0.13	0.63109	extend	H-mesh	<b>to:</b>	37 x 35 x 4	17100	
4	1.05100	0.17	0.63410	dS= 3 extend dS= 2	8, dF= H-mesh 8, dF=	348, to:	shift window 37 x 36 x 4 shift window	13800	
5	1.02827	0.21	0.63348	extend dS= 1	H-mesh %, dF=	to: 14%,	37 x 37 x 4 shift window	11529	Source, fission matrix.
6	1.02118	0.25	0.61732	extend	H-mesh	10°	$37 \times 37 \times 5$	9997	& mesh
7	1.02018	0.29	0.61762	dS = 0	δ, αF= ° dπ-	1U3,	shift window	8746	stabilization
8	1.02413	0.32	0.61845	ds = 0	°, dr- % dr-	א <sup>ס</sup> י, קצ	shift window	7790	
9	1.01974	0.37	0.61766	dS = 0	%, dF=	78,	shift window	6974	
10	1.01709	0.43	0.61656	dS= 1	%, dF=	5%,	shift window	6313	
11	1.02129	0.48	0.61606	dS= 1	%, dF=	5%,	shift window	5815	•
12 13 14 15 16	1.01705 1.02459 1.02193 1.02741 1.03005	0.53 0.58 0.65 0.70 0.73	0.61452 0.61263 0.61214 0.60894 0.60600					5351 4975 4640 4372 4091	Block
17 18 19 20 21	1.03266 1.03369 1.03485 1.03631 1.04159	0.78 0.83 0.87 0.91 0.96	0.60435 0.60065 0.59622 0.59177 0.58774					3852 3628 3426 3245 3074	cycles

fmatrix keff= 1.12401, DR= 0.91098, iters= 199

20 21	1.03631 1.04159	0.67 0.71	0.59177 0.58774	3245 3074
21	1.04159 fmatrix k CONVERGEN entropy entropy relativ slope o slope o slope o slope o slope o slope o slope o slope o	0.71 eff= 1.12 CE INFO & for fmat for neut e entropy f keff (t f keff (t f keff (c f keff (a f entropy f entropy f entropy dif, neu	0.58774 2401, DR= 0 <b>CHECKS:</b> crix eigenve cron last o for last o racklen) collide) bsorb) X marginal X marginal X marginal z marginal	3074 0.91098, iters= 199 (based on last 10 cycles) ector = 0.35378 cycle = 0.58774 dif= 66.13% cycle = 2.06901 = 2.0E-03, target: < 4.7E-04 FAIL = 2.1E-03, target: < 4.8E-04 FAIL = 2.0E-03, target: < 5.2E-04 FAIL = -2.6E-03, target: < 3.9E-04 FAIL 1 = -2.1E-03, target: < 3.9E-04 FAIL 1 = -2.1E-03, target: < 3.7E-04 FAIL 1 = 8.7E-04, target: < 3.0E-04 FAIL = 7.1E-01, target: < 1.0E-02 n/a
	Kolmo-S Chi-squ rel-h-b	mirnov, d are, d lock, d onvergend	listrib, sta listrib, sta listrib, sta e tests wer	at = 6.8E-01, target: < 9.1E-02 FAIL at = 5.0E+04, target: < 5.0E+02 FAIL at = 2.5E+00, target: < 5.0E-03 n/a re NOT passed *****
	MISCELLAN rmse fmat nn	EOUS INFC = z=	) & CHECKS: 1.16 % 11882, 0.0	09 %
22	1.10895	0.75	0.38293	accelerate: Imin= 0.2, Imax= 4.7
23	1.11427	0.78	0.35428	accelerate: Imin= 0.2, Imax= 2.5
24	1.11602	0.81	0.35248	accelerate: $\min = 0.2$ , $\max = 5.0$ 1258
25	1.12045	0.84	0.35200	

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### **MCNP6** example

fmatrix keff= 1.11538, DR= 0.91466, iters= 127 **CONVERGENCE INFO & CHECKS:** (based on last 10 cycles) entropy for fmatrix eigenvector 0.35254 = entropy for neutron last cycle 0.35212 dif= -0.12% = relative entropy for last cycle = 0.00744 slope of keff (tracklen) = -5.3E - 05, target: < 6.5E-04PASS 7.1E-05, slope of keff (collide) = target: < 5.0E-04PASS = -6.8E - 06, slope of keff (absorb) target: < 5.0E-04PASS Quantitative slope of entropy = -2.2E - 05target: < 2.9E-04PASS slope of entropy X marginal = 5.8E-05, target: < 5.4E-04PASS **Evidence** slope of entropy Y marginal = -1.5E-04, target: < 4.1E-04PASS For slope of entropy Z marginal = -5.8E-05, target: < 2.7E-04 PASS entropy dif, neuts vs fmat = 2.6E-03, target: < 1.0E-02PASS Convergence Kolmo-Smirnov, distrib, stat = 2.4E-03, target: < 9.1E-02PASS distrib, stat = < 5.0E+02 Chi-square, 3.4E+01, target: PASS rel-h-block, distrib, stat = 9.7E-04, target: < 5.0E-03PASS \*\* FISSION SOURCE HAS CONVERGED, based on last 10 cvcles \*\* \* \* \*\* Metrics: \*\* \* \* slope of keff (tracklen) (within uncert) is O slope of keff (collide) \*\* is O within uncert) \* \* \*\* slope of keff (absorb) is O \* \* (within uncert) Quantitative \*\* slope of entropy is O \* \* (within uncert) \*\* slope of entropy X marginal is O within uncert) \*\* Evidence slope of entropy Y marginal \*\* \*\* is O (within uncert) For \*\* slope of entropy Z marginal \*\* is O (within uncert) entropy dif, neuts vs fmat \* \* is O (within uncert) \*\* Convergence \*\* \* \* **Distribution checks:** \*\* Kolmo-Smirnov, distrib, stat, neut vs fmat (within conf) \* \* \*\* distrib, stat, neut vs fmat (within conf) \* \* Chi-square, \*\* rel-h-block, \* \* distrib, stat, neut vs fmat (within conf) Convergence is locked-in, even if some tests fail in future cycles 42 Active cycles will begin with cycle = 241 Active cycles will end with cycle = 200 Total active cycles to be run =

50	1.12150 2.29 0.34704 9 1.11528 0.00178	401
51	1.10686 2.33 0.34698 10 1.11444 0.00180	395
	fmatrix keff= 1.11491, DR= 0.91140, iters= 114	
	CONVERGENCE INFO & CHECKS: (based on last 10 cycles)	
	<pre>entropy for fmatrix eigenvector = 0.35151</pre>	
	entropy for neutron last cycle = 0.34698 dif= -1.29% relative entropy for last cycle = 0.01079	
	<pre>slope of keff (tracklen) = 3.9E-04, target: &lt; 8.8E-04</pre>	PASS
	<pre>slope of keff (collide) = 5.1E-04, target: &lt; 1.1E-03</pre>	PASS
	slope of keff (absorb) = $4.2E-04$ , target: < $1.1E-03$	PASS
	slope of entropy = $-5.8E-04$ , target: < $2.1E-04$	FAIL FAIL
	slope of entropy X marginal = $-7.9E-04$ , target: < $3.0E-04$ slope of entropy X marginal = $-7.9E-04$ target: < $4.4E-04$	FAIL Fati.
	slope of entropy 7 marginal = $7.1E-07$ , target: $< 2.2E-04$	PASS
	entropy dif, neuts vs fmat $= -9.6E-03$ , target: $< 1.0E-02$	PASS
	Kolmo-Smirnov, distrib, stat = $5.6E-03$ , target: < $9.1E-02$	PASS
	Chi-square, distrib, stat = 9.9E+01, target: < 5.0E+02	PASS
	rel-h-block, distrib, stat = 2.8E-03, target: < 5.0E-03	PASS
	convergence checks passed at cycle = 41	
	active cycles based on fmatconvrg begin at cycle = 42	
	entropy for fmatrix eigenvector = 0.35151 entropy for neutron active cycles = 0.34819 dif= -0.94% relative entropy for active cycles = 0.00298	
	<b>POPULATION SIZE INFO &amp; CHECKS:</b> (based on last 10 cycles)	
	population check using relative entropy	PASS
	warning: The average entropy for the last cycles differs from the entropy for the fission matrix fundamental mode by -1.1%. This indicates undersampling or possible clustering. CONSIDER USING MORE NEUTRONS/CYCLE.	

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## **OECD-NEA Source Convergence Problem TEST4S**



## **OECD-NEA Source Convergence Problem TEST4S**

#### 50,000 neuts/cycle, acceleration, auto-converge, k = 1.1165 (2)



## MCNP6 Test Problems for Fission Matrix Based Automated Convergence & Acceleration of K-eigenvalue Problems

- VALIDATION\_CRITICALITY benchmark suite
- Godiva bare HEU sphere
- PWR2d commercial PWR
- ATR advanced test reactor
- C5G7 3D U-Mox benchmark, OECD-NEA
- Triga reactor
- ACRR burst reactor, with FREC
- LCT-078-001 Sandia critical experiment
- 3D PWR Hoogenboom-Martin benchmark, OECD-NEA
- Whitesides problem K-effective of the world model
- TEST4S simplified Whitesides, OECD-NEA
- FPOOL OECD-NEA source convergence benchmark 1

## VALIDATION\_CRITICALITY benchmark suite

- Standard MCNP validation suite since 2002 (Mosteller)
  - 31 ICSBEP Handbook problems, critical experiments
  - Run using ENDF/B-VII.1 nuclear data
  - Timing results include all I/O, input & xsec file processing, Monte Carlo random walks, printing results, etc. for all 31 problems

#### Timing tests

- 50 M neutrons/cycle for all runs
- For standard runs, 100 inactive cycles, 100 active cycles
- For auto accelerate & converge,
  100 active cycles

**Standard run:** 

106 minutes

Auto accel & converge:

80 minutes

## **Godiva Problem**



## **Whole-core 2D PWR Model**



## **Advanced Test Reactor**



J5-G45JUL1-1U1a

## **OECD-NEA Benchmark - C5G7**

Figure 2. Fuel pin layout

Reflected B.C.



## **TRIGA** Reactor







100

## Sandia burst reactor - ACRR, with FREC



#### Sandia critical experiment – LCT-078-001, 1,057 rod assembly





#### **OECD-NEA** "Hoogenboom-Martin Performance Benchmark"



## Whitesides' Model Problem – K-eff of the World

#### 9 x 9 x 9 array of Pu-239 spheres

- 729 spheres
- Void between spheres
- Surrounded by 30 cm water
- Sphere radii ~ 4 cm
- Pitch = 60 cm
- Keff ~ 0.93

Replace center sphere of array by larger (critical) sphere

#### Should be supercritical - is it ?

#### whitesides



### **OECD-NEA Source Convergence Problem TEST4S**

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## **OECD-NEA Fuel Storage Pool**



## **Current Work**

### • Summer 2019

- Limited release to NCS early adopters, more testing & feedback

### Near-term R&D Work

#### Source guess

- Handle a list of axis-oriented bounding boxes (AABB)
- For 1 large bounding box, handle source overruns
- Should be possible to completely automate

#### Fission matrix

- Better eigensolver ?
- Investigate matrix size vs neutrons/cycle
  - Statistical noise on matrix elements effect on solution & stability
  - Kord-Smith problem, fuel storage pool problem

#### Convergence tests

- Add more ?
- Determine precise confidence level for passing all tests
- Acceleration
  - Possibly find more robust, stable method
- Population size tests
  - Scheme for predicting adequate size
- More examples & tests

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