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# Information Based Analysis of Fission Source Correlation

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## Abstract

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### Information Based Analysis of Fission Source Correlation

Brian Kiedrowski (Univ. Wisconsin) & Forrest Brown (LANL)

The variances estimated by Monte Carlo codes in k-eigenvalue calculations are underpredicted due to inter-cycle correlation between fission sources. The mutual information serves as a diagnostic to measure the correlation between fission source distributions in different cycles. There is a definite observed relationship between the variance bias and the mutual information of the source distributions. Furthermore, using the mutual information in conjunction with the Wielandt method shows how effective a particular Wielandt shift is at removing variance bias. Finally, the dominance ratio and the mutual information are related to MacMillan's correction.

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## Overview

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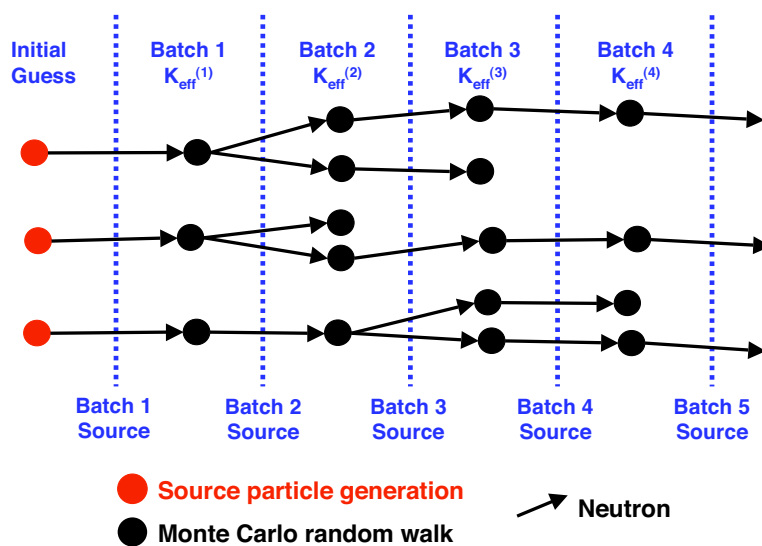
- Fission source correlation
- Mutual Information
- Application to Wielandt Method
- Relationship to Dominance Ratio

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## MCNP Criticality Calculations

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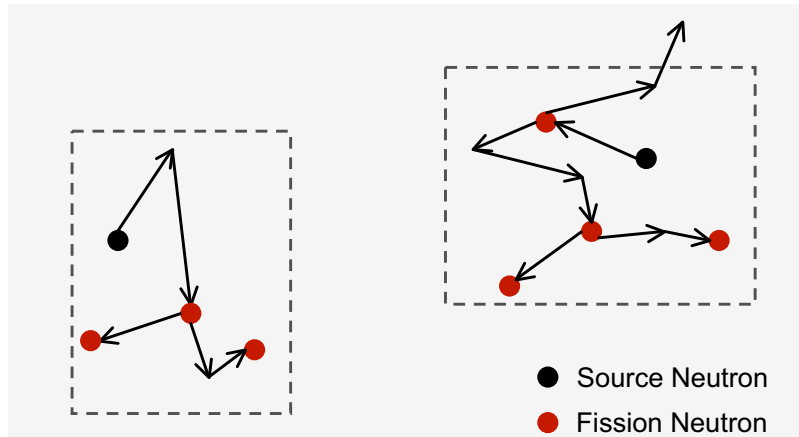
- Power iteration method:



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## Fission Source Correlation

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Fission neutrons in following generations tend to be near the source neutron in the previous generations.

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## Fission Source Correlation

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- Correlation always positive
- Causes underprediction of variance:

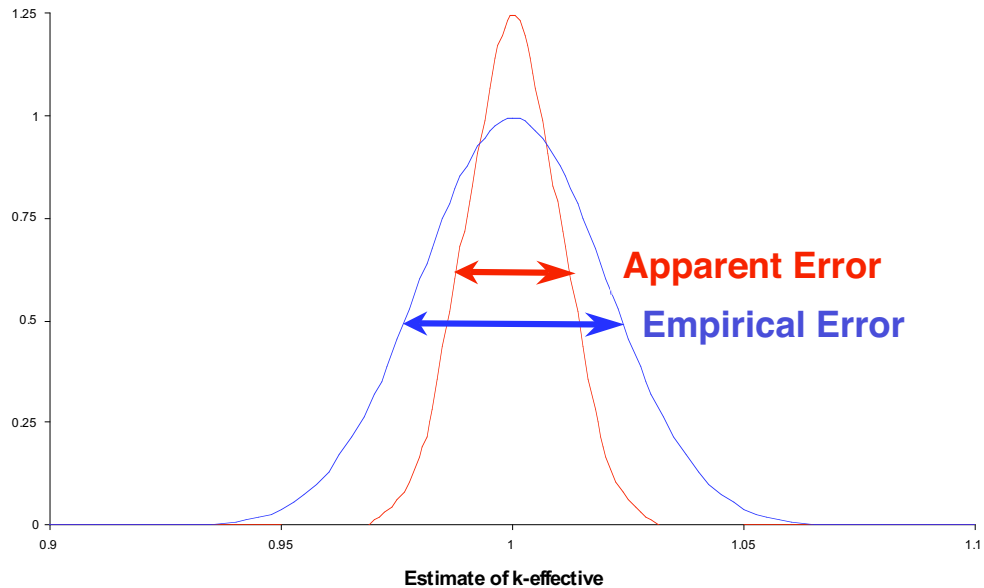
**Apparent Variance:** 
$$\tilde{\sigma}_{\bar{x}}^2 = \frac{1}{N} \left[ \frac{1}{N-1} \sum_{i=1}^N x_i^2 - \bar{x}^2 \right]$$

**Empirical Variance:** 
$$\sigma_{\bar{x}}^2 = \tilde{\sigma}_{\bar{x}}^2 + \sum_{i,j} r_{ij}$$

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## Variance Bias

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## Variance Bias

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- Most Monte Carlo codes give apparent error
- Should give empirical error
  - MacMillan's factor (highly conservative)
  - Lag coefficients (subject to stochastic noise)
  - Brute force method (very time consuming)
    - Average numerous (25-100+) results from calculations with different random number seeds.

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## Variance Bias

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- Small impact on k-effective (5-20%).
- Significant impact on local tallies:

Benchmark	Tally $\frac{\sigma}{\tilde{\sigma}}$
Godiva	1.43
Two Cylinder	4.56
B&W Core	3.34
Checkerboard	3.97

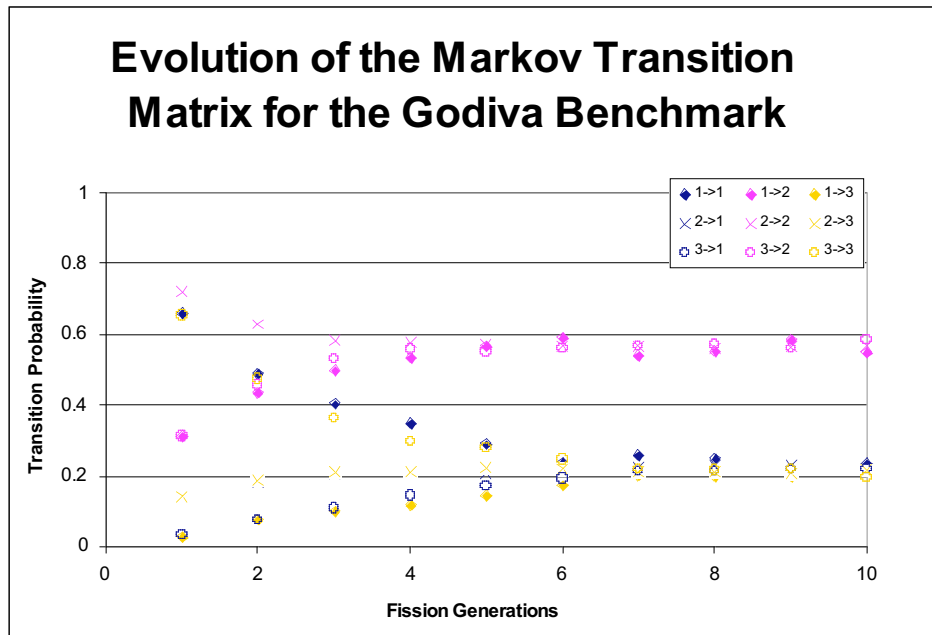
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## Ergodicity of Fission Source

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- Intercycle correlation should decrease with separation distance.
- True if fission source transition is an ergodic Markov chain.
- Ergodic: Loss of memory of initial state after many transitions.
  - Fission matrix for  $j$  transitions step measures.
  - Final state independent of initial state.

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- Information about initial state lost each transition.
- Loss of information implies loss of correlation
  - Final state independent of initial state
- Since correlation leads to variance bias, can some simple measure help estimate this?

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## Mutual Information

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- Measures information gained about an unmeasured result from the measurement of another.

$$I(X, Y) = H(Y) - H(Y | X)$$

- Measured from fission matrix elements:

$$I = \sum_i \sum_j F_{ij} \log \left( \frac{F_{ij}}{f_i f_j} \right)$$

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## Mutual Information

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- Measures correlation between fission populations in one  $\Sigma$  generation to the next.
- As separation distance increases to infinity, mutual information goes to zero.

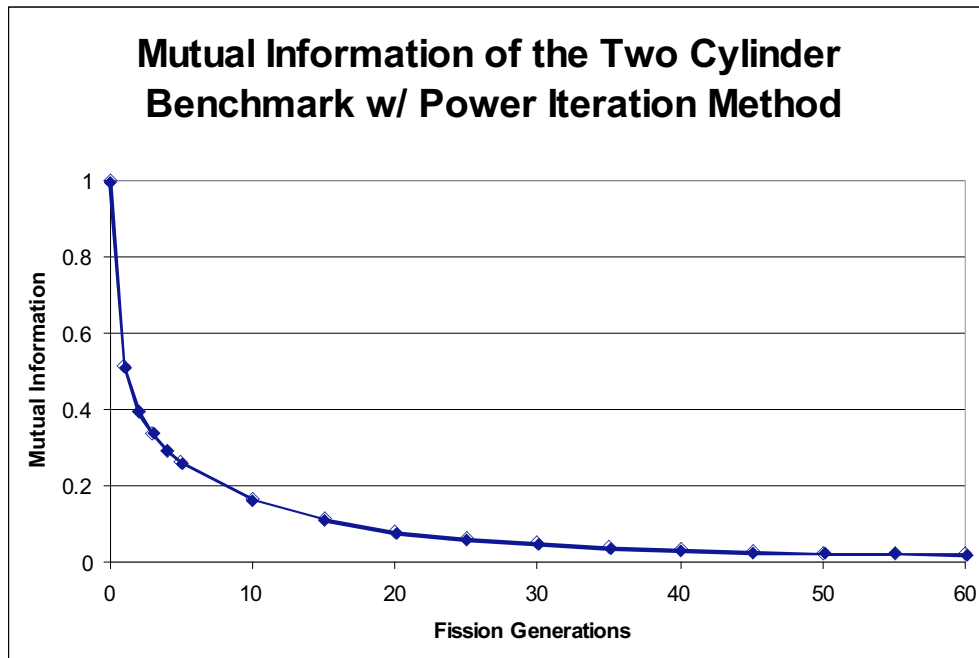
$$F_{ij} = f_i f_j$$

$$I = \sum_i \sum_j f_i f_j \log \left( \frac{f_i f_j}{f_i f_j} \right) = 0$$

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## Mutual Information Decay

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## Mutual Information Convergence

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- Mutual information sensitivity to mesh size for Godiva problem.

Mesh Spacing	Mutual Information
<b>3x3x3</b>	<b>0.233</b>
<b>4x4x4</b>	<b>0.225</b>
<b>5x5x5</b>	<b>0.217</b>
<b>6x6x6</b>	<b>0.211</b>

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## Mutual Information Convergence

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- Mutual information sensitivity to batch size for Godiva problem (3x3x3 mesh).

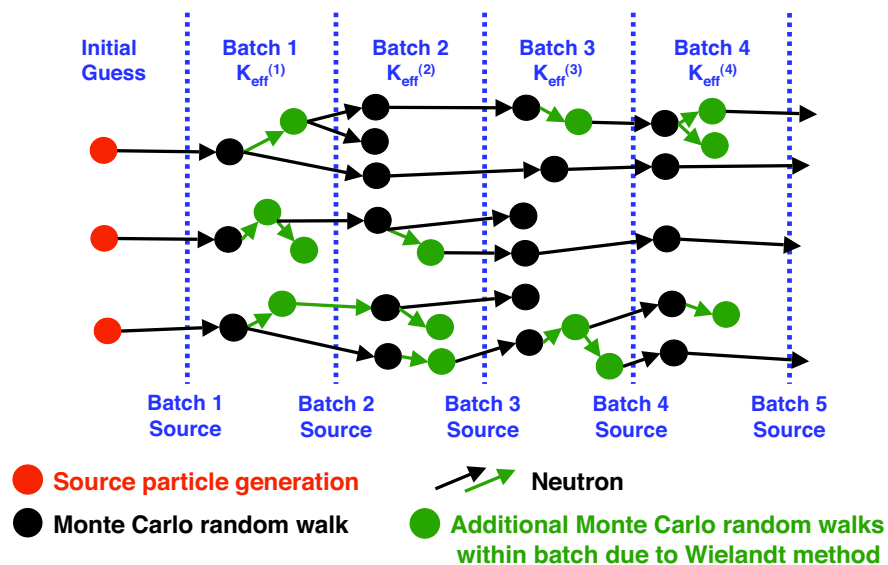
Batch Size (histories)	Mutual Information
$10^2$	0.558
$10^3$	0.327
$10^4$	0.241
$10^5$	0.230
$10^6$	0.229

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## Wielandt Method

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- Stochastically extends the number of generations within a cycle.

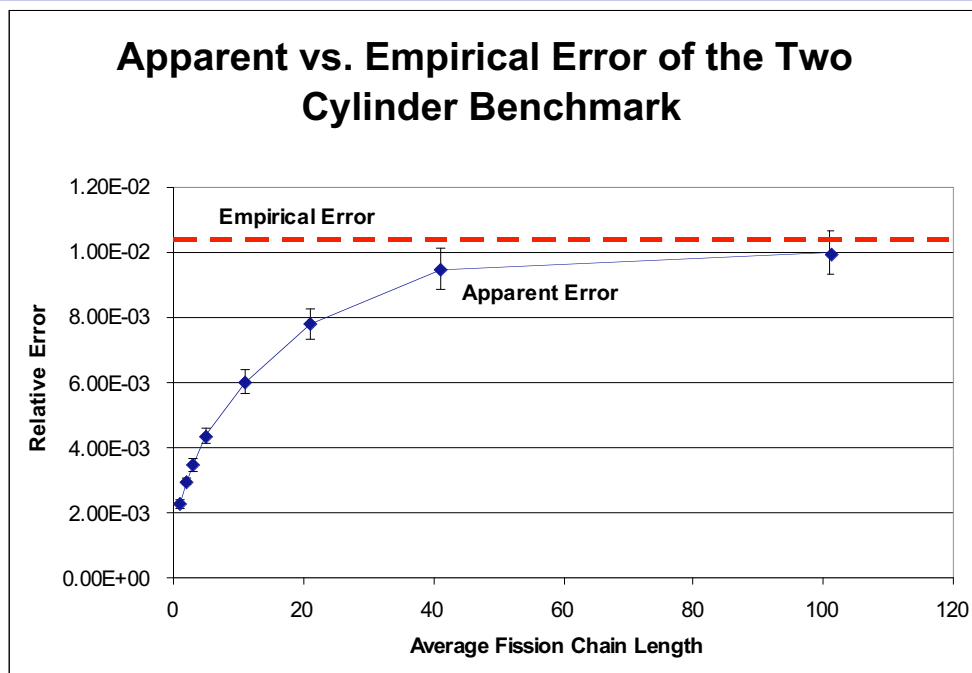


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- **Longer fission chains**
  - Decrease the number of cycles required for convergence (same CPU time).
  - Reduces bias in error estimates.
- **Average chain length:**

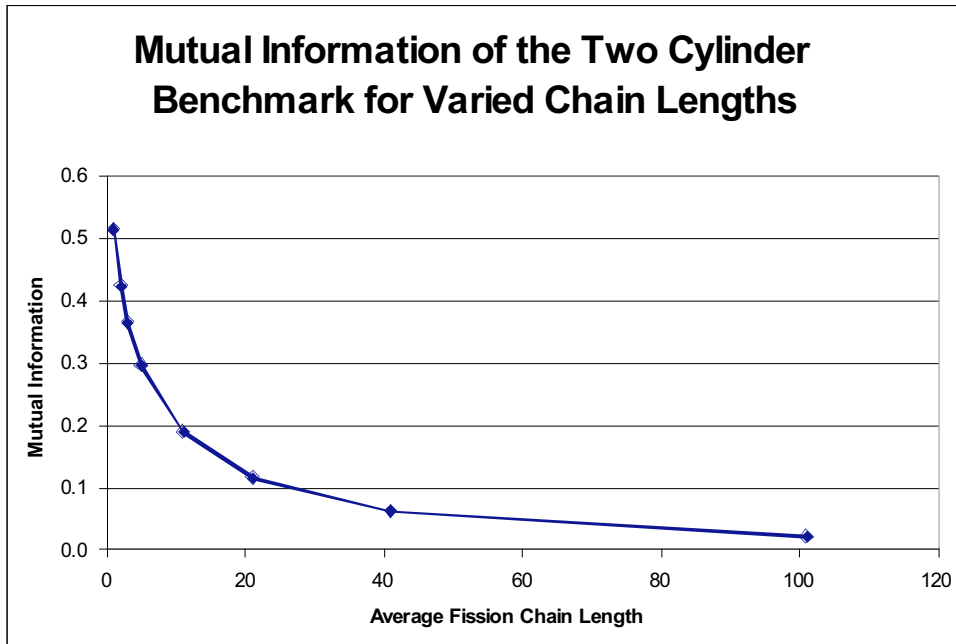
$$L = 1 + \frac{k_0}{\Delta_W}$$

## Wielandt Method Results



## Wielandt Method Results

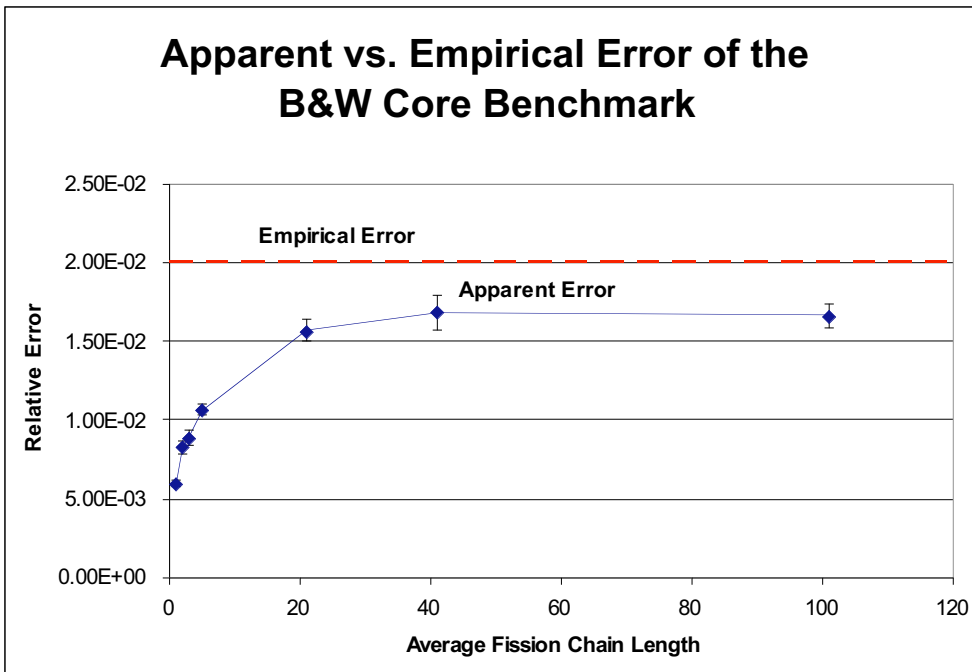
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## Wielandt Method Results

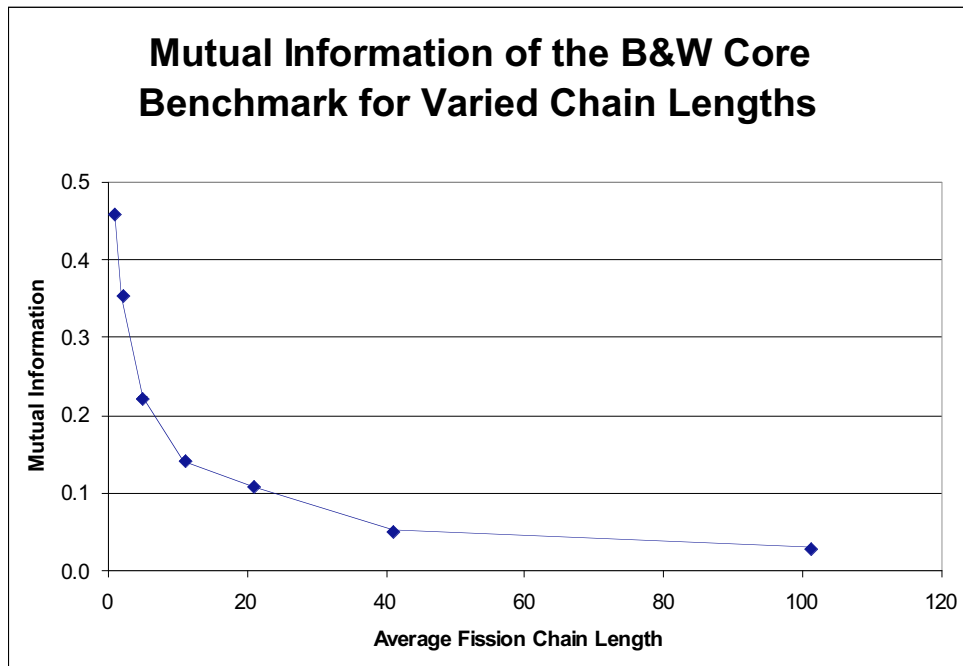
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## Wielandt Method Results

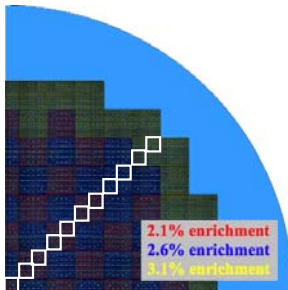
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## Wielandt Method Results

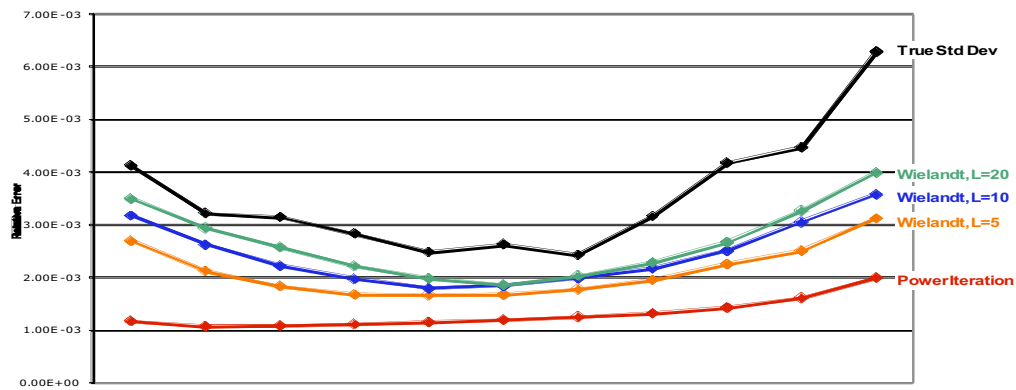
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2D quarter-core PWR (Nakagawa & Mori model)

- + Explicit fuel pins & rod channels, 17x17
- + 120 M active neutrons for each calculation
- + Tally fission rates in each quarter-assembly

Plot relative error in quarter-assemblies along diagonal



## Observations

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- **Mutual information seems to provide a good measure of variance bias in MOST problems.**
- **B&W Core benchmark shows disagreement.**
  - More investigation needed.
- **Variance bias is local in nature.**
  - Mutual information is global.
  - No clear relationship to k-effective.

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## Dominance Ratio

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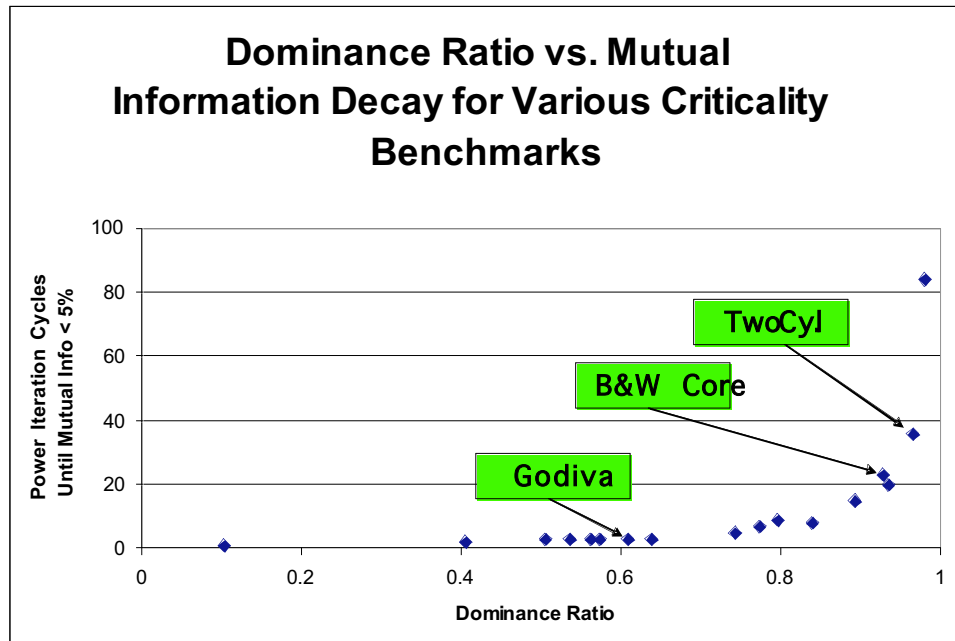
- **Measures effect of higher order modes.**
- **Stochastic fluctuations excite higher modes.**
- **Higher dominance ratio means slower decay, and more correlation.**

$$\rho = \frac{k_1}{k_0}$$

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## Dominance Ratio vs. Mutual Information

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## Relation to MacMillan Factor

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- MacMillan's factor:

$$M = 1 + \frac{2r}{1 - \rho}$$

- Mutual information curve appears to follow similar asymptotic trend.
  - Suggestive, but more analysis needed.

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## Conclusions & Future Work

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- **Mutual information is a useful diagnostic to get general feel of correlation effects.**
  - No definitive connection to variance bias.
- **Very suggestive for many problems.**
- **Still issues:**
  - Connection to global k-effective estimates
  - B&W core convergence issues
  - Local variations

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## Questions?

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