# NE 155 Introduction to Numerical Simulations in Radiation Transport

**Probability and Statics** 

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- Parallelization: efficient use of computers

# **OUTLINE / LEARNING OBJECTIVES**

- 1 Probability Density Functions
- Standard Statistical Quantities
- 3 Accuracy vs. Precision
- 4 Central Limit Theorem
- **5** Relative Error

- 1 Understand the derivation of basic statistical quantities
- ② Be able to explain the difference between accuracy and precision
- 3 Understand how to interpret and apply confidence intervals
- Understand derivation and use of relative error

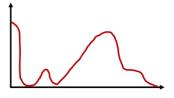
Notes derived from Jasmina Vujic and Paul Wilson

#### **FUNDAMENTAL CONCEPT**

- Many individual particle histories are simulated
- Each physical event is determined by randomly sampling a probability distribution
- Each history can contribute to the physical measurement of interest
  - $x_i$  = contribution of history i
  - Different ways to calculate score
    - Does particle cross surface?
    - How much time does particle spend in particular region?

### FUNDAMENTAL CONCEPT

• Set of individual contributions,  $x_i$ , forms a *probability distribution* 



• We are interested in the mean value of that contribution,  $\overline{x_i}$ , and its variance,  $S_{\overline{x}}^2$ 

### TO THE BOARD



### TWO TYPES OF MC METHODOLOGY

#### Analog

- Natural laws are preserved
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#### Non-Analog

- To reduce computation time, the strict analog simulation of particles is abandoned (i.e. we CHEAT)
- Variance Reduction techniques:
  - Absorption suppression
  - Russian Roulette (history termination)
  - Splitting (history propagation)
  - Forced collisions
  - Source biasing
  - · Hybrid methods

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- No alteration of PDFs
- At collision, particle is killed if absorption
- Particle is born with weight 1
- weight unchanged throughout history
- Score when tallying events is 1

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### Analog

- No alteration of PDFs
- At collision, particle is killed if absorption
- Particle is born with weight 1
- weight unchanged throughout history
- Score when tallying events is 1

#### Non-Analog (weighted)

- Alter PDFs to favor events of interest
- Particle can have different birth weight
- Weight is altered if biased PDF is used
- Particle survives "absorption" and weight is changed
- Splitting and RR can change weight
- Score current weight when tallying

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- The difference between accuracy and precision is important
- Accuracy is not always known and can be difficult to improve
- Precision can be improved by more histories in a measurement, but not always more histories in a problem

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