



## PROBABILISTIC MODELING OF THE RENAL STONE FORMATION MODULE

Integrated Medical Model Exploration Medicine Capabilities Project

Lauren M. Best<sup>1</sup>

Jerry G. Myers<sup>1</sup> Debra A. Goodenow<sup>1</sup> Michael P. McRae<sup>2</sup> Travis C. Jackson<sup>3</sup>

<sup>1</sup> NASA Glenn Research Center, Cleveland, OH
 <sup>2</sup> Rice University, Houston, TX
 <sup>3</sup> University of Nebraska, Lincoln, NE







- Overview of IMM
- Renal Stone Risk Module
- Probabilistic Wrapper Front End
- Biochemistry Model
- Probabilistic Wrapper Back End



**Potential Medical** 

**Condition** 



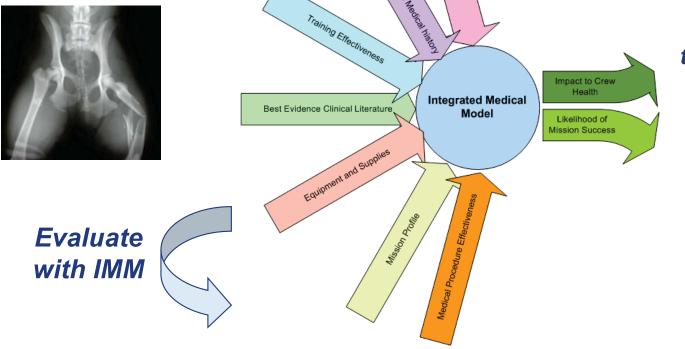
### Integrated Medical Model (IMM)

 IMM is a probabilistic tool – quantifies the probability and consequences of medical risks

Treatmeth Options

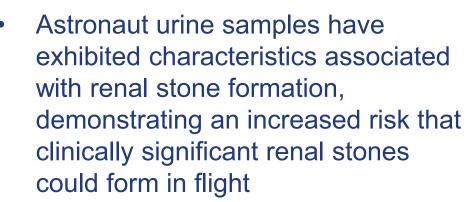
Identifies medical resources necessary to optimize health and mission success

Likelihood of occurrence, probable severity of occurrence, and optimization of treatment and resources





## Renal Stone Risk Module



- External module to IMM
  - Adds higher fidelity to model where little data is available
- Deterministic Model (Kassemi et. al)

   integrates physics and physiology
   into formation of renal stone based
   on probabilistic input
- Probabilistic Wrapper feeds needed information into deterministic model and transforms output into a useful distribution of risk of renal stones







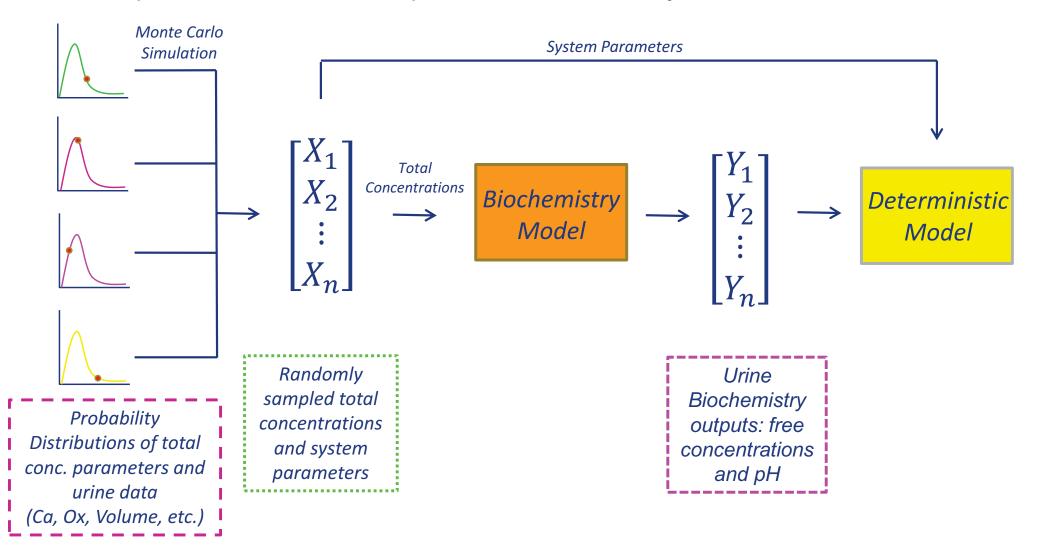




## Probabilistic Wrapper: Front-End



Through Monte Carlo methods, randomly samples array of probability distributions to compile a set of random inputs into biochemistry and deterministic model





## Monte Carlo Sampling



- Lognormal probability distributions formed from  $\bar{x}$  and  $\sigma$  and number of desired MC samples (N) in MATLAB
  - Truncated to the 95<sup>th</sup> CI
  - Example:

$$P_{Ca} = \begin{bmatrix} X_{Ca_1} \\ X_{Ca_2} \\ \vdots \\ X_{Ca_N} \end{bmatrix}$$

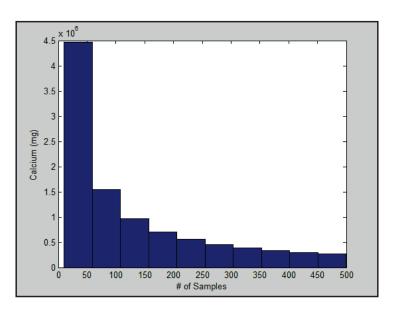
- Parameters randomly sampled and placed into matrix
- Parameter matrix is divided by randomly sampled volume to create total concentrations (mol/L)

$$[M] = \frac{\begin{bmatrix} P_{Ca} & P_{Ox} & \cdots & P_{Creat} \end{bmatrix}}{V}$$

#### Parameters:

- Calcium
- Oxalate
- Uric Acid
- Citrate
- Sulfate
- Phosphate

- Magnesium
- Sodium
- Potassium
- Ammonium
- Creatinine (Creatine)



Example histogram of Calcium (truncated)



### **Biochemistry Model**



- JESS Biochemistry model compiles 100+ applicable urine chemistry reactions and computes outputs based on system parameters and thermodynamics
- Transforms total concentration matrix, M, via system of equations into free ion concentrations (c<sub>i</sub>) based on urine chemistry reactions
- Free ion must be converted to activity (a<sub>i</sub>) for deterministic model:

 $a_i = \frac{\gamma_i c_i}{c^{\ominus}}$ ,  $\gamma_i$  = species activity coefficient  $c^{\ominus}$  = standard concentration





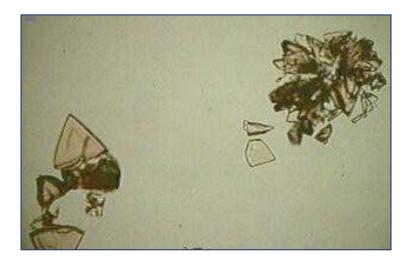
## **Biochemistry Model**



- Relative Supersaturation calcium oxalate (RS<sub>CaOx</sub>)
  - More of the dissolved material than could be dissolved by the solvent
  - RS: Metric that represents the ability of spontaneous crystallization of the solution

 $RS = [C_{Ca}C_{Ox}\gamma_{CaOx}]^{1/2}$ 

 Necessary outputs to deterministic model: activity (indirect), pH, temperature, pressure, RS<sub>CaOx</sub>

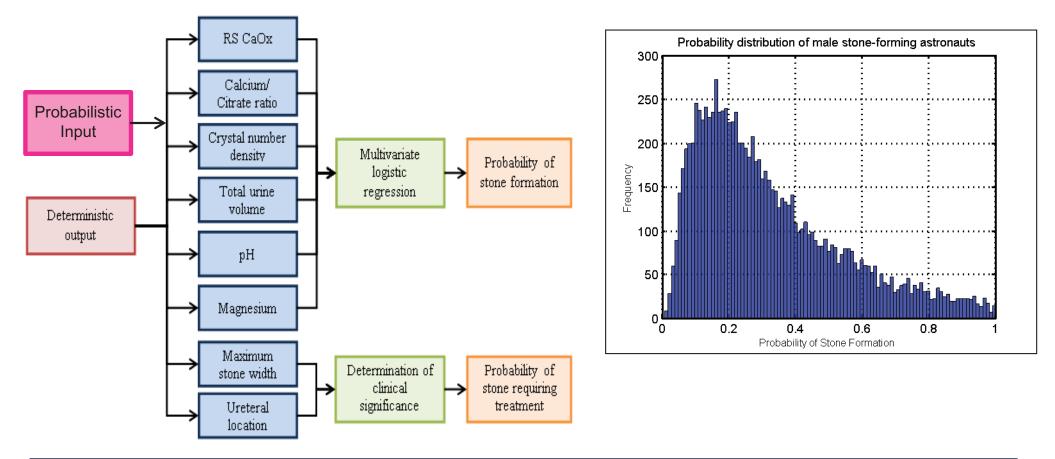






# Probabilistic Wrapper: Back-End

- Couples deterministic model output and randomly sampled input parameters to quantify the risk of stone formation and treatment
- Utilizes two major sections: (Initially design by Mike McRae and Travis Jackson)
  - 1. Probability of stone formation
  - 2. Probability that a stone passes spontaneously (without treatment)





## Back-End Continued...



- Stone Formation:
  - Determined by Multivariate logistic regression equation below via MATLAB statistical functions
  - Additional parameters can be added with additional  $\beta$  factors

$$P(SF) = \frac{1}{1 + e^{-(\alpha + \beta_1[RS] + \beta_2[\frac{Cit}{Ca}] + \beta_3[TV] + \beta_4[pH] + \beta_5[Mg])}}$$

- Stone Passage:
  - Determined via spontaneous passage rates related to renal stone width and ureter stone location
  - Treatment determined by the probability of stone passage:

P(Treatment) = 1 - P(Passage)







- Mohammed Kassemi
- Ilana Isokovitz
- Kelly Gilkey
- DeVon Griffin
- Peter May