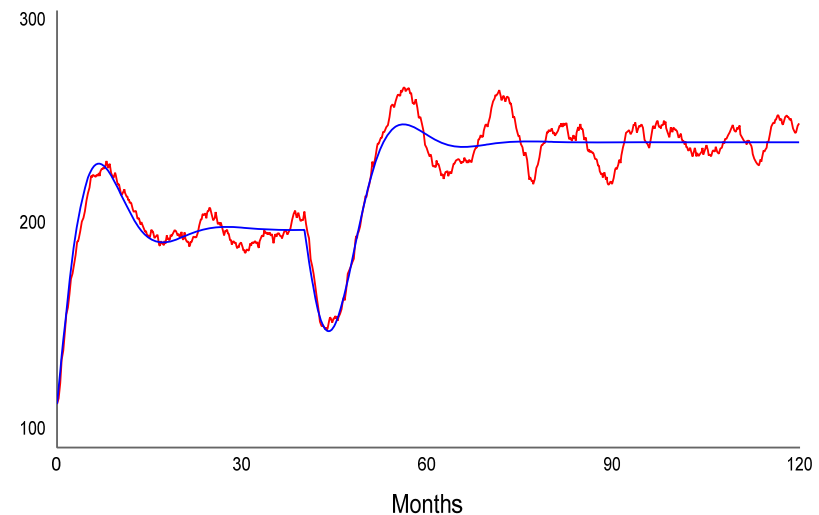
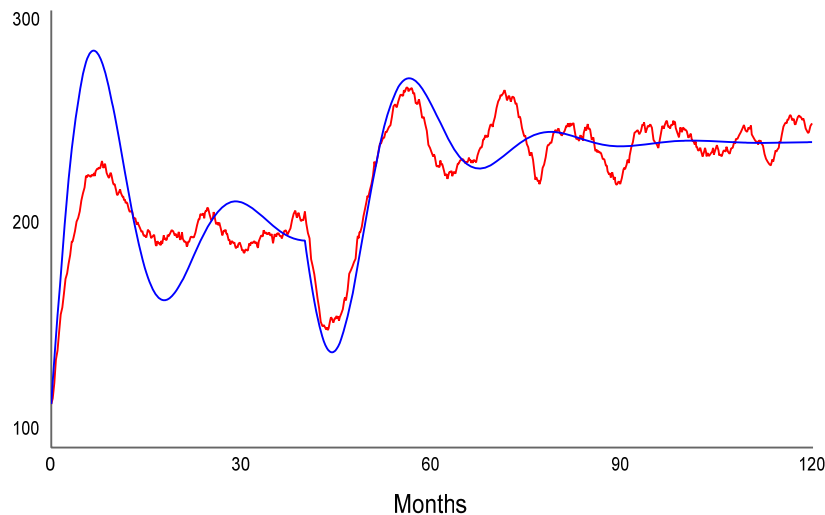
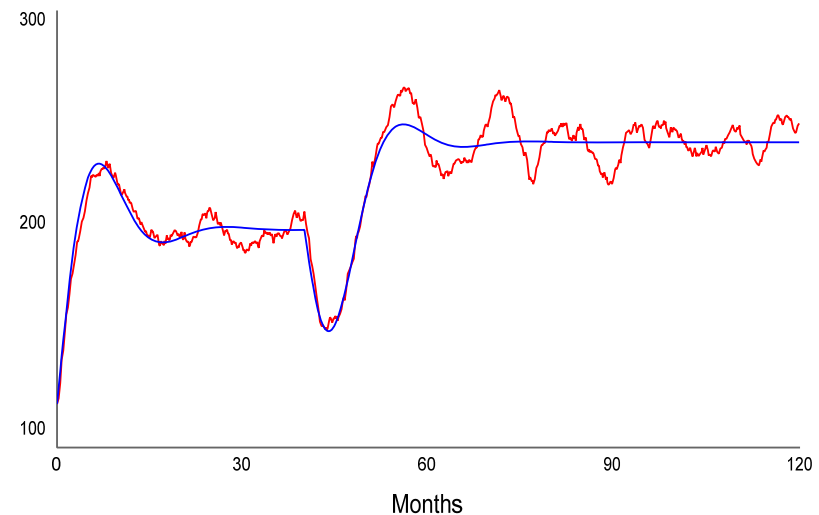
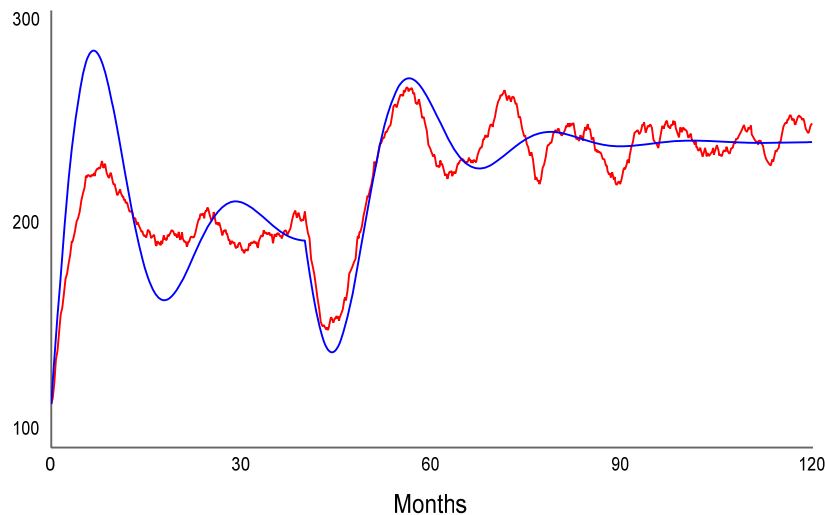


# Calibration and Data Handling



with Stella®  
the presentation will begin shortly...

# Calibration and Data Handling



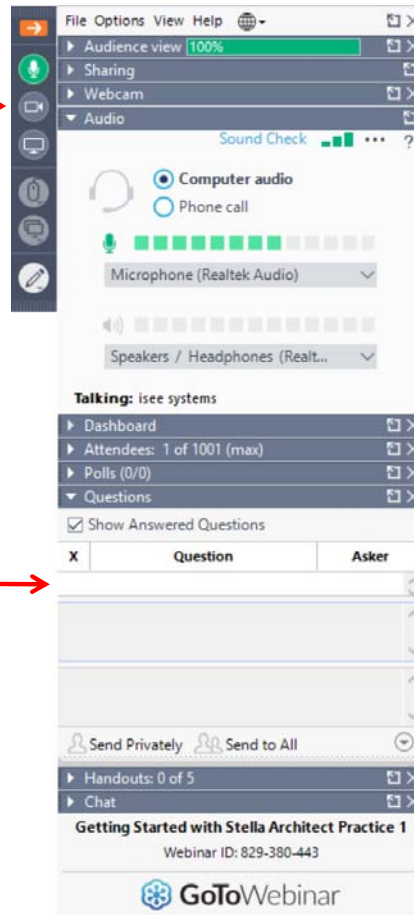
with Stella®

Presented by Bob Eberlein --- January 30, 2019

# Webinar Mechanics

## Grab tab

Enables you to hide or display control panel and toggle between full-screen and window mode



## Questions

Submit your questions here at anytime during the Webinar

## Audio setup

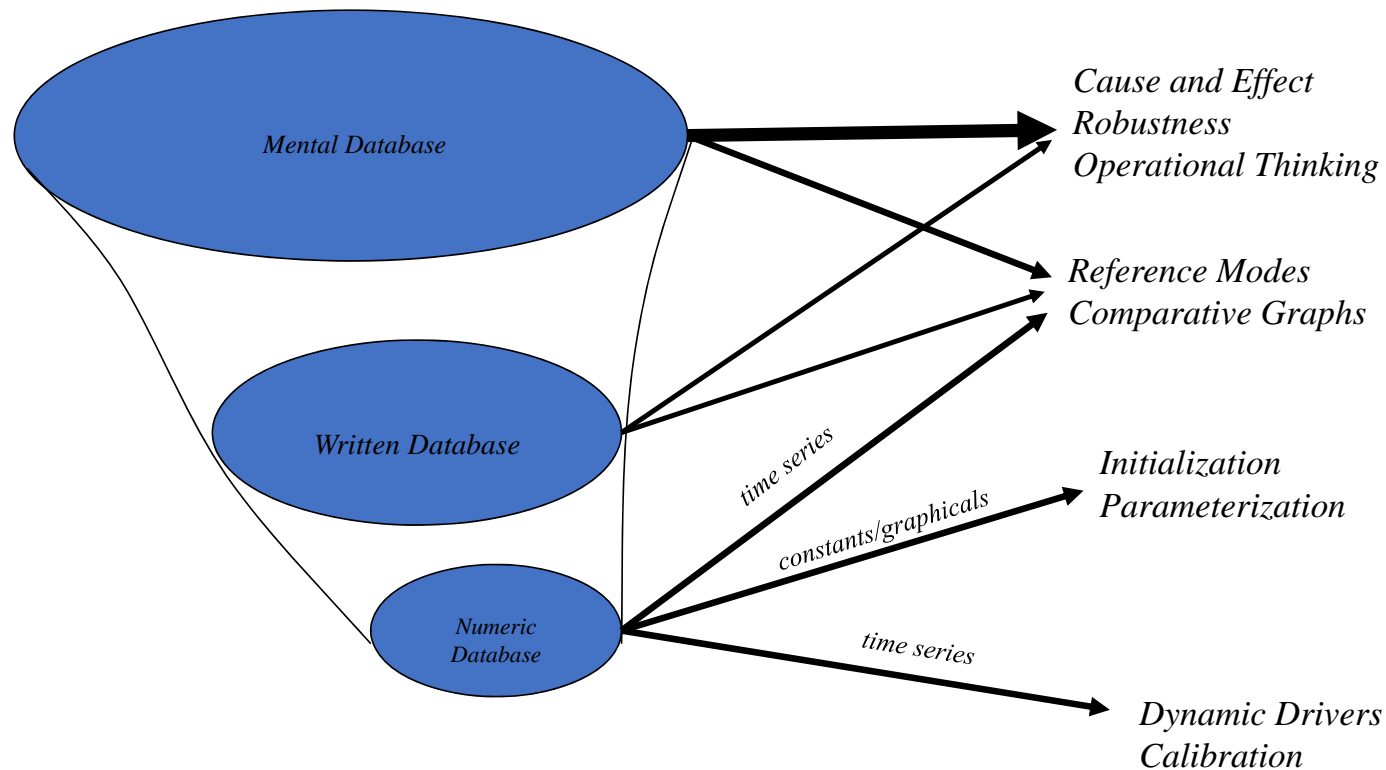
Allows you to test your audio

Also make sure your volume is turned up and your speakers are not muted.

# Today's Topics

- Perspective on Data
- Importing parameters and graphical function values
- Exporting results
- Importing time varying values
  - As controls and as runs
- Calibration
  - Payoffs, data sources and weights
  - Calibration control
  - Confidence bounds
- Summary observations
- Q & A

# Perspective on Data



# Importing Parameters Background

- We put parameters and initial values into equations
  - Definitional
    - Units conversion
    - Normally not imported
  - Derived
    - Theory or measurement
    - Importing allows like assumptions to be put together into a single place
  - Assumed
    - Used to control scenarios or experiments
    - Importing allows easy organization of different assumption sets
- Graphicals are used to describe nonlinear x,y relationships
  - Typically these are derived, though sometimes assumed
  - Time can be the x axis
    - Time varying parameters which will be discussed more

# Importing Parameters Mechanics (import01)

- The import process is the same regardless of purpose
- Build the model
- Organize the Content
  - Excel or CSV files
  - Row or Column Headers (software figures out which)
    - Must be model variables, or one dimensional array slices (\* or Dimension name)
    - Graphicals are fully specified
      - Can be only y or x and y
  - Values
    - One for a parameter
    - Multiple for array slices – each is an array element
    - Multiple for graphicals – each is an entry in the graphical
      - Paired (equal number of entries) for explicit x,y

# Importing Parameters Mechanics 2

- Use the import dialog from the Model menu
- Select the source
  - Select the sheet for excel
- Select what to do with the imported values
  - Set their equations
    - Only constants can be set, and equations are changed
  - Control them
    - The value is used instead of the equation which remains unchanged
- Set the conditions under which they will be read
  - Dynamic – whenever a run is made or things are changed
  - On demand – when action is taken



# Exporting Results (Export01)

- Model simulations are stored in a database (isdb) format
- Can also export these results to both csv and Excel files
  - Using Export Data on the Model Menu
    - All results
      - Or at a time
    - Parameter values (changed and unchanged)
    - Table values for tables marked for export
  - Using the Parameter Control panel
    - Saves changed parameter values
      - (subset of parameter values above)
- Notice format of All Results
  - That is our next import format

# Importing Time Varying Values (Import02)

- As driving variables
  - This is a variation of the parameter import process
  - More compact and flexible than the graphical imports
    - Missing values are fine
    - Additional interpolation options
- As a run for easy comparison
  - Imported using the data manager (interpolated when displayed)
- Format is the same in both cases
  - Essentially the same as parameters, same as exported
    - With the first row or column presenting time values
- Can use both of these for calibration
  - Payoff definition will take care of data point selection

# Transitioning to Computed Values (Projections)

- Put together the data for what has happened
- Create model equations for behavioral response
  - Stocks can't be controlled so need special consideration if included
- Import the data using the Inside option
  - Reverts to the model equation when the data run out (and before they start)
  - Don't need to add switching logic to the model
- Can be used to set up scenarios using Lead In Time
  - On the interface
  - Controls will override the value set in the import file
  - The other interpolation options can be used in this case

# Questions on Data?

- Coverage was very fast
  - The models are available for study
- Data format description  
<https://iseesystems.com/help#cs hid=1108>
- Import dialog documentation  
<https://iseesystems.com/help#cs hid=1046>
- Export dialog documentation  
<https://iseesystems.com/help#cs hid=1042>
- Data Manager documentation  
<https://iseesystems.com/help#cs hid=1039>

# Calibration - Conceptual Frame

- What?
  - Making a model representative of the system being modeled
  - Adjusting model parameters (and structure) so behavior matches data
- Why?
  - Face validity
  - Finding out what is wrong with the model
    - Theory rejection
- How?
  - Build the model with measured values computed
  - Load in time varying data on those values
  - Define a payoff based on comparison with those values
  - Optimize over an appropriate set of parameters

# Example – AIDS Infections and Deaths

- Simple Bass Diffusion (SIR) Model (AIDS01)
  - Open the model
- Early CDC Data (AIDS\_data.txt)
  - Bring in the data
- Face Validity
  - Not with the parameters there
  - Can adjust to achieve this
    - Contact rate = 5
    - Initial Infected = 5
- Is that good enough?

# Payoff Definition

- For outcome optimization it is relative weights that matter
  - Often based on denominating components the same (for example \$)
  - The guidance for calibration is similar
    - But statistical assumptions can help refine the choices
- Calibration payoffs are based on comparison
  - Only when data exist
- Two built in definitions
  - Squared error
    - The normal distribution assumption common in statistics
  - Absolute error
    - Less sensitive to outlying values
  - Both allow a tolerance zone – specialty use

# Variance and Weights

- Use  $1/\text{Variance}$  of the expected error as the weight
  - Usually we will need to use data to create a variance based on realized values
  - Use the VAR.P function in excel
    - Get 0.003 and 0.005 for infections and deaths respectively
- Stella will do this automatically
  - Using the model predicted values
- This definition allows interpretation of the payoff value
  - Should be approximately equal to the number of data points
    - Across all series
    - By construction at the value where weights are computed
  - Confidence bounds are computable



# Optimization Setup

- Same as it is done for outcome optimization
  - average risk tenure – 0.1 - 20
  - average survival time – 0.1 – 20
  - contact rate – 0.5 – 40
  - initial at risk population – 0.0 – 100,000
  - new at risk population – 0.0 – 10,000
  - Initial infected – 0 – 20
- How is the outcome?
  - Experiment with payoff weights
  - What observations can be made?
- Can we reject this model?
  - Yes

# Confidence Bounds – and a Grain of Salt

- Percentages based on an assumption of normal errors
  - Set to 95%
- Shows how much movement is required to change the payoff enough
  - Sensitivity means tighter bounds
  - Not sensitive – might fail
- Add in infection percent as search parameter
  - Results do not change
  - Has a narrow bound
  - Clearly is not derivable just by studying structure

# Confidence Bounds – a Cleaner Example

- Open CalibrationConfidenceBounds
  - Run
- Weights are set to automatic
  - Optimize
- Optimize a second time
  - Confidence bounds change
- Pay attention to relative ranges
  - Don't report values blindly
  - Compute weights independently for better statistics

# Calibration - Observations

- It is fun and easy to work with data
  - It grounds model assumptions and results
    - Pick measures people can relate to
- Behavior comparisons are a useful touchstone
  - Not the only one
    - Operational thinking provides many more
- Calibration fits a model to data
  - Its ultimate scientific purpose is to reject
- Validity, or more precisely value, is a bigger question
  - Physics
  - Common sense
  - Measured numeric values

# Questions?

## **More information:**

<https://iseesystems.com/help#cs hid=1100>

## **Upcoming Webinar Topics:**

Building Multiplayer Games with Arrays and Wildcards

Using Stella to Trace Causality

# Contact

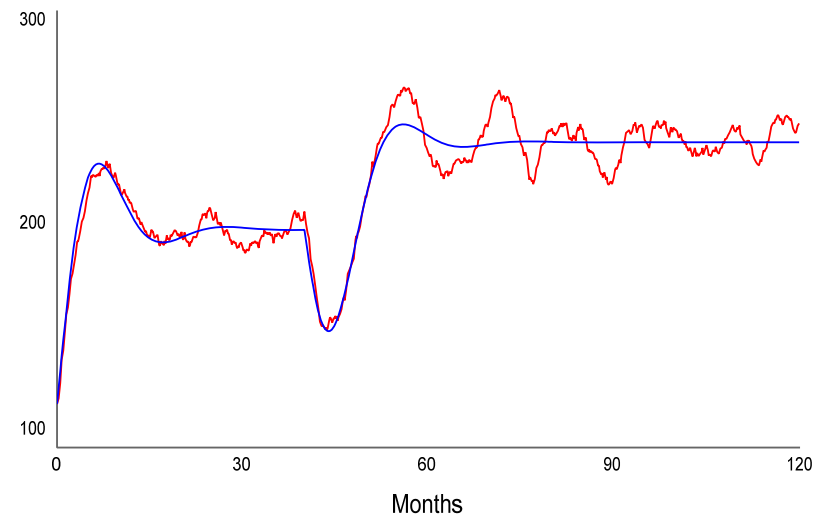
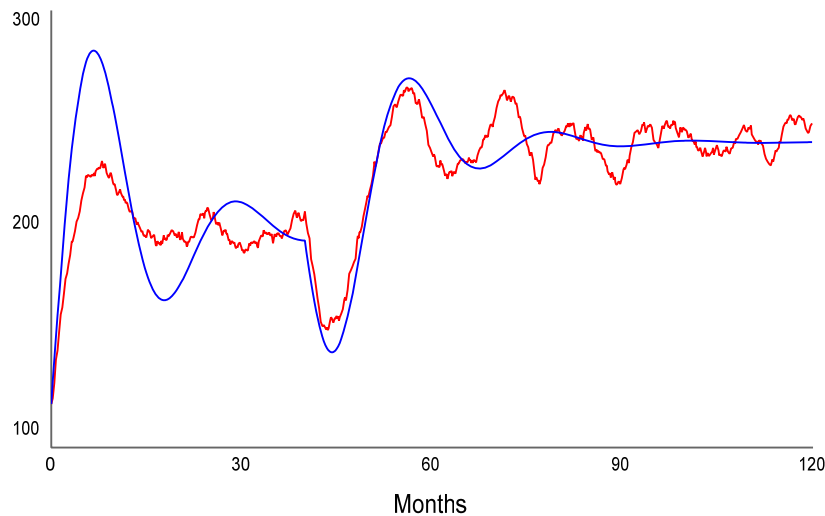
## Support

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# Calibration and Data Handling



Thank you!