# Functional Curation: Potential Future Directions for SED-ML

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#### **Outline**

- Introduction to Functional Curation
- Suggestions for SED-ML
  - Interfacing protocols and models
  - Sequenced and nested simulations
  - Post-processing
- Summary

## **Functional Curation**

- How can we compare models?
- Which model is best suited to investigating this experiment?
- What functionality does a model have?

We are implementing a system to answer these questions.

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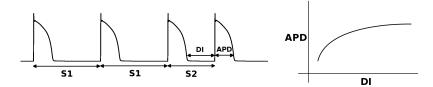
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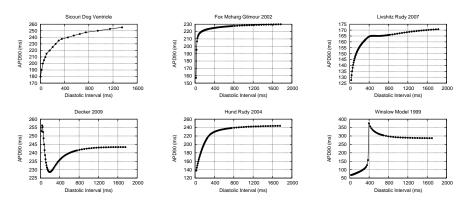
# Complex post-processing

- SED-ML dataGenerators are currently fairly restrictive
- Many standard cardiac protocols require additional functionality
- Example: S1-S2 restitution



# Example: S1-S2 protocol on canine models

Our system currently has its own protocol language. We'd like to use SED-ML instead!



See also doi:10.1016/j.pbiomolbio.2011.06.003



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  - Minimal extensions to MathML, many possibilities
- Protocol libraries for usability
  - Allow different UIs to target different levels of user

## The parts of our protocols

- Documentation
- Input specifications
- Protocol imports<sup>1</sup>
- Library definitions
- Units definitions
- Model interface
- Simulations
- Post-processing
- Output specifications
- Plot specifications



<sup>&</sup>lt;sup>1</sup> Not yet implemented

# Referring to model variables

- SED-ML uses XPath to locate variable elements
- What if models use different naming conventions or structures?
- Instead, use ontological annotation of variables
- Protocol can use prefix:name notation as for XML namespaces
- No need for 'approved' ontology just need model & protocol to agree

#### Units conversions

- Different models use different units
- Protocol declares the units it uses, and conversions applied automatically
- "Biology-aware" conversion rules can be defined
  - A unary function for converting a value from one dimension to another
  - Can refer to model variables using ontology terms
  - Fall-back to next rule if required variables don't exist
  - See also doi:10.1016/j.pbiomolbio.2011.06.002

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- Only those equations required for the given outputs need be computed
- Equations may also be added or replaced
  - e.g. to specify a stimulus current waveform

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- - Simulations may define a prefix, allowing outputs from any simulation in a sequence to be addressed
- Nesting simulations supports parameter scans, repeated runs, distribution sampling, etc.
  - Model outputs therefore become regular n-dimensional arrays

#### Modifiers

- Each simulation can have a collection of modifiers
  - There are 3 kinds of modifier:

SaveState store the current model state, giving it a name ResetState reset the model to a stored state or initial conditions

SetVariable set the value of a model variable

The value is given by an expression in the post-processing language, and can access the current range value for this or any outer loop.

 Each can be applied just at the start or end of a simulation, or prior to each loop

# Post-processing language

- Aim to support complex operations with minimal implementation overhead
- Therefore base on MathML, with as few as possible added csymbols
- Key features:
  - Operators for working with n-dimensional arrays
  - Sequencing operations (assignments to variables, assertions)
  - Defining functions (that can also be passed to other functions)
- Not just used for post-processing: also input specifications, library definitions, etc.
- Technically, this is a pure functional n-dimensional array based programming language

# Main special expressions

#### newArray Create a new array

- by listing elements (which may be arrays)
- by comprehension using a generator expression with index ranges (abusing domainofapplication)
- view Extract a sub-array
  - Can use arbitrary (even negative) strides over any dimension, with wildcards
  - map Map an *n*-ary function onto *n* arrays element-wise
- fold Collapse an array along a single dimension using a binary function
  - Used to define sum, max, etc.
- find Find indices where the operand array is non-zero
- index Create a sub-array containing only the given indices
  - Various options for avoiding irregular results



# Summary of proposals

- Interfacing protocols with models
  - Refer to model variables with ontology terms
  - Apply units conversions, with user-defined rules
  - Modify model equations if required/possible
- Sequenced and nested simulations
  - Hence outputs are n-dimensional arrays
  - Vector ranges using post-processing language to compute 1d array
  - Modifers: save/load model state, set variable
- Array-based post-processing
  - Functions can be defined in the language
  - Operations can be sequenced
  - Array comprehensions, views, map, fold, find & index
- Protocol libraries for usability



#### Extra slides

The slides that follow are not central to the talk, but have extra bits of information that might be useful for questions.

## Ranges

- Each simulation requires a range over which to iterate for generating output points
  - UniformRange, VectorRange and FunctionalRange have been proposed
  - Using post-processing language constructs to define an array of values, our VectorRange can implement all of these

## **Nested protocols**

(Not yet implemented)

- Since a protocol has inputs and outputs, it can be viewed as a kind of model
- The "system of equations" abstraction does not apply, so model modifications are not possible
- This does effectively allow us to interleave post-processing and simulation however
- So we can do e.g. dynamic restitution without breaking the 'regular n-d array' data model

#### **Environments**

- A store mapping names to values
- Bindings may not be overwritten
- Multiple environments exist
  - e.g. for protocol inputs, library, model variables, simulation ranges & outputs, post-processing operations & results, function locals
- Environments can delegate lookups
  - Prefixed references go to the associated environment (e.g. specific simulation, imported protocol, model variable)
  - Many also have a default delegatee

#### Statements

- The statementList is used for function bodies, and the library & post-processing sections
- 3 kinds of statement:
  - Assignment: MathML eq
  - Return: return only valid in functions
  - Assert: assert for checking arguments etc.

#### Miscellaneous technicalities

- Environments binding names to (immutable) values
- Accessors (IS\_ARRAY, SHAPE, etc.)
- Tuples
- Default parameters
- Wrapping MathML operators as functions
- Location information for user-friendly error messages