## Putting the "I" in the IAM: Computation and Data Management

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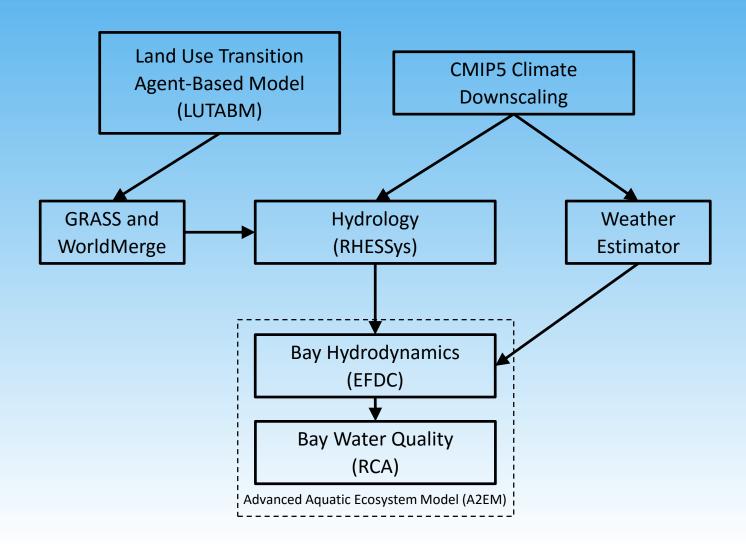


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# The Integrated Assessment Model





### Computation v1.0

**One Scenario, 20 Years** 

RCA RCA

**RCA** 

RCA

RCA

RCA

RCA

RCA RCA

RCA RCA

1 Year | 1 Y



RCA RCA RCA RCA

RCA RCA

RCA RCA RCA

360MB / Yr

Climate Data: 545MB / Yr



### **Pegasus**



- The Pegasus Workflow Management System manages the data flows and job execution
- Built on HTCondor, a distributed computing platform
- We define the workflow and data files needed for input, and Pegasus monitors the workflow and executes jobs when:
  - 1) Input data is available
  - 2) Computational resources are available
- Uses directed acyclic graphs (DAGs) to plan workflow



- Fully automated the IAM, including some of the post-run analysis and visualization
- Redesigned the IAM to be ready to support feedbacks
- Support continuity between years for the bay biochemical model
- Utilize UCAR's Yellowstone
- Unpacking of the bay water quality model binary output files to ease feedback to other models

#### **Automation**



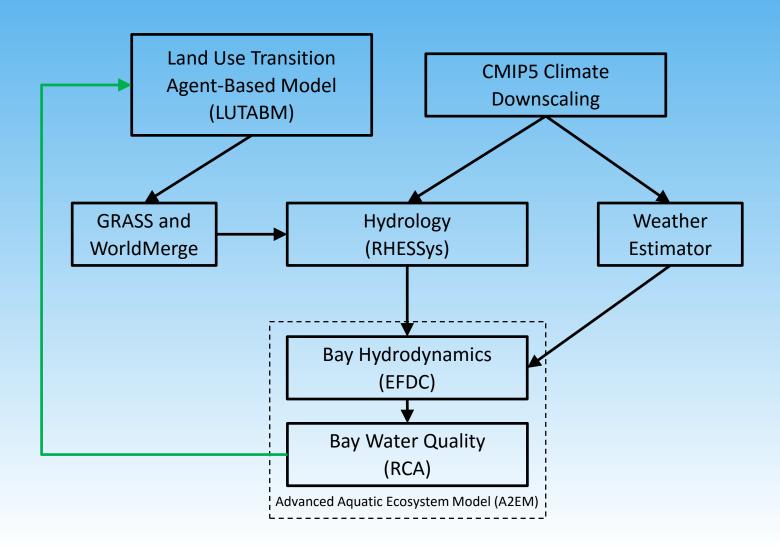
```
# ======= SCENARIO CONFIGURATION ======= #
 'ABMS': ['IED', 'IDEV', 'LWFP', 'LPFP'],
 'DECADES': [2001, 2011, 2021, 2031],
  'GCMS': ['ipsl-cm5a-mr.1', 'miroc-esm-chem.1', 'mri-cgcm3.1', 'noresm1-m.1'],
 'RCPS': ['rcp85', 'rcp45', 'rcp60'],
 'RANDOM SEED': 54,
'RUN': False,
 'DECADES ARE DEPENDENT': True,
 'USE YELLOWSTONE FOR LAKE': True,
 'YELLOWSTONE USER': '******',
 'YELLOWSTONE ALLOCATION': '******',
 'GLOBUS USER': '*****,
  'DATA REUSE DIR': False,
 'EMAIL ON START': True,
 'EMAIL ON FAILURE': True,
 'EMAIL ON SUCCESS': True,
```



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## The Integrated Assessment Model





### **Computation v1.0**

**One Scenario, 20 Years** 



LUTABM

**Full Timeline** 

**GRASS** 

Full Timeline

RHESSys 10 Years RHESSys 10 Years

EFDC 1 Year	_	_	_	_	_	_	_	_	_	_	_	_	_	_	_	_	_	_	_
RCA 1 Year																			RCA 1 Year

### Computation v2.0

**Four Scenarios, 40 Years** 



Decade 1	LUTABM 10 Years  GRASS 10 Years  RHESSys 10 Years	Decade 1	Decade 1	Decade 1
1 Year 1 Year 1 Year 1 Year RCA RCA RCA RCA	CC EFDC EFDC EFDC EFDC EFDC 1 Year 1			
	Decade 2	Decade 2	Decade 2	Decade 2
	Decade 3	Decade 3	Decade 3	Decade 3
	Decade 4	Decade 4	Decade 4	Decade 4



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## Computation v2.0

**One Scenario, 10 Years** 



**LUTABM** 

10 Years

**GRASS** 

10 Years

RHESSys

10 Years

EFDC 1 Year					
RCA 1 Year					

### Computation v2.1

**One Scenario, 10 Years** 



**LUTABM** 

10 Years

**GRASS** 

10 Years

RHESSys

10 Years

| EFDC   |
|--------|--------|--------|--------|--------|--------|--------|--------|--------|--------|
| 1 Year |

RCA – Year 1

RCA - Year 2

RCA – Year 3

RCA – Year 4

RCA – Year 5

RCA – Year 6

RCA – Year 7

RCA – Year 8

RCA – Year 9

RCA – Year 10



- Fully automated the IAM, including some of the post-run analysis and visualization
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## Computation v2.2

**Four Scenarios, 10 Years** 



Scenario 1	LUTABM 10 Years		Scenario 2	Scenario 3	Scenario 4
 	GRASS 10 Years				
	RHESSys 10 Years				
	oC EFDC EFDC EFDC EFDC EFDC EFDC EFDC EFD	1.0	EFDC 10 x 1 Year	EFDC 10 x 1 Year	EFDC 10 x 1 Year
	RCA – Year 1 RCA – Year 2 RCA – Year 3				
	RCA – Year 4 RCA – Year 5 RCA – Year 6				
	RCA – Year 7 RCA – Year 8				
	RCA – Year 9 RCA – Year 10				



- Fully automated the IAM, including some of the post-run analysis and visualization
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## Binary → CSV

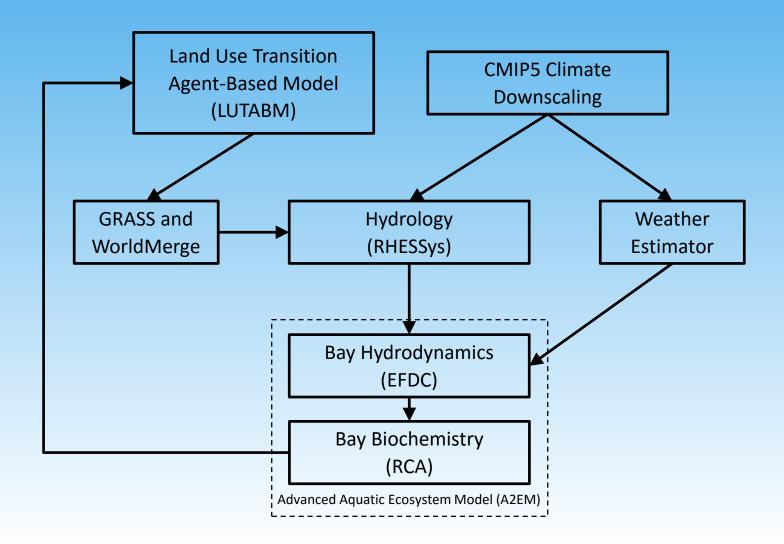


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```
RCA Simulation Results - Scenario: ipsl-cm5a-mr.1 rcp60
Exported: 2016-01-26 14:09:22.645967
Grid ID, 1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11, 12, 13, 14, 15, 16, 17, 18, 19,
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J Grid,7,7,7,8,8,8,9,9,9,10,10,10,10,10,11,11,11,11,11,1
2001-01-01 01:00:00,0.000210,0.000210,0.000210,0.016500,
2001-01-01 13:00:00,0.000457,0.000457,0.000457,0.002805,
2001-01-02 13:00:00,0.000952,0.000952,0.000952,0.000851,
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2001-01-09 13:00:00,0.004417,0.004417,0.004417,0.005647,
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2001-01-21 13:00:00.0.010362.0.010362.0.010362.0.010440.
2001-01-22 13:00:00,0.010862,0.010862,0.010862,0.010856,
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# The Integrated Assessment Model





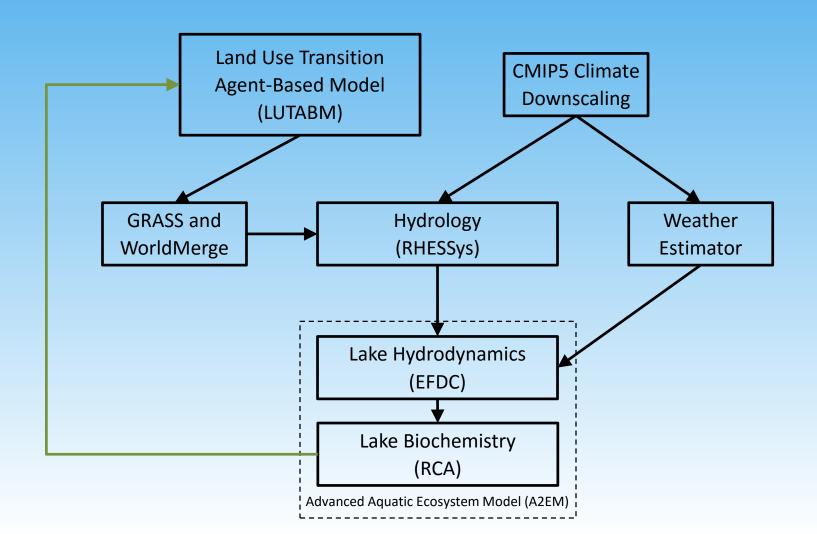
#### **Future Work**



- Coming Soon
  - LUTABM will supply BMP adoption percentages for RHESSys
  - LUTABM will incorporate data from RCA
- Wish List
  - Automate more analysis / visualizations
  - Use Yellowstone for other IAM components
  - Natively compile EFDC / RCA for Linux
  - Improve error handling and restarting

# The Integrated Assessment Model





## Computation



16 40-Year Scenarios:

For Each Scenario:

**16 Processes** 

Land Use Transition
Agent-Based Model
(LUTABM)

**16 Processes** 

GRASS and WorldMerge

64 Processes

Hydrology (RHESSys)

x Number of Years / 10 (Parallel)

640 Processes

Executed on Yellowstone

Lake Hydrodynamics (EFDC)

x Number of Years (Parallel)

640 Processes

Lake Biochemistry (RCA)

x Number of Years (Serial)

## Computation



16 40-Year Scenarios:

For Each Scenario and Decade:

**64 Processes** 

Land Use Transition
Agent-Based Model
(LUTABM)

**64 Processes** 

GRASS and WorldMerge

**64 Processes** 

Hydrology (RHESSys)

640 Processes Executed on Yellowstone

Lake Hydrodynamics (EFDC)

x 10 (Parallel)

640 Processes

Lake Biochemistry (RCA)

x 10 (Serial)