# Measuring & Modeling HPC User Productivity: Whole-Experiment Turnaround Time

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## Background

- Productivity while using existing code
- HPC users face an optimization problem
- Objective: lower experiment turnaround time
  - Experiment: Everything from moving data to analysis and archival
- Many ways to affect total time to solution
  - Change code, system, job shape
  - Alter problem or IO needs
  - Attempt to influence center policy
- Users have a hard time predicting effects

# Talk Outline

Questions users ask when planning experiments

• The main question: How can we help them plan better?

- Expert and Non-Expert users
- An illustrative story
- Questions along the way
- Playing "what-if"?

# Questions Users Ask When Planning

- How long will this experiment take?
- When do I have to start running to use all my allocation?
- Would I be done faster if I ran it on a different system?
- Is it worth my time to optimize code performance?
- Will I be done faster if I ran it on more processors?
- How much time am I losing in the queue?
- Should I pay for express queue priority?

# How can we help users plan experiments?

Show them their **bottlenecks** and quantify the **effects of their options**.

# An illustrative story

- An HPC user (call him Bob) has a large simulation
  - Uses an entire Terascale system
  - ~20 48-hour jobs
  - several Terabytes of output per job
- Bob believes that a single dedicated run slot would be most productive.
  - Queue hurts larger jobs more
  - System reliability at scale
- Quantitative impact of queue wait on different systems

### How can we help?

- How do we find out what Bob's specific bottlenecks are?
- How do we get Bob to tell us what he's doing?
- Can we develop a model of Bob's whole experiment?
- Can we use simulation to predict the effects of a change:
  - In code performance, system choice, or policy effects?
- Can we simulate multiple workflows to guide system choice and site policy?

#### How do we find out what Bob's specific bottlenecks are?

- We need to get a description of his workflow
  - How many jobs he's running
  - How much data they produce
  - What he does with the data after it's produced
- We need to know what systems he could be using, and performance characteristics of those systems
- It's important not to leave out steps that are potential bottlenecks
  - Application characterizations can ignore non-computational bottlenecks
- We need to know everything he does to complete his experiment

## How can we get him to tell us everything he's doing?

- We could observe him
  - Difficult to do in person, long-term
  - Difficult to capture everything automatically
- We could ask him
  - Enough detail?
- We use a **conceptual model** to guide the interview
  - Represents a variety of user workflows
  - Experiment tasks at an appropriate level of detail for discussion

# Eliciting user workflow

- We use the model on the right
  - How much time in each state?
  - What path does he take through the states?
  - What different systems does he use in each state?
- Have him draw his own path through the states
- Helps to make sure we don't ignore any steps
- Helps generate more detailed model for simulation



| Local Storage    Transfer    Analysis      Local Compute System    Computation    Vertical Compute System      Remote Compute System    Event System    Event System |                                | Archival             |                |                            |  |            | Transfer                 |
|--|--------------------------------|----------------------|----------------|----------------------------|--|------------|--------------------------|
| Transfer  Analysis    Local Compute System   |                                |                      |                |                            |  |            | Local Storage            |
| Transfer  Analysis    Local Compute System  Queue Wait    Queue Wait  Computation    Remote Compute System   |                                |                      |                |                            |  |            |                          |
| Queue Wait  Computation    Remote Compute    System  | Analysis                       |                      | Transfer       |                            |  | Svstem     | Local Compute S          |
| Queue Wait  Computation    Remote Compute    System  |                                |                      |                |                            |  | - <b>,</b> |                          |
| Remote Compute<br>System   |                                |                      |                | Computation                |  | Queue Wait |                          |
|  |                                |                      |                |                            |  | te         | Remote Compute<br>System |
|  |                                |                      |                |                            |  |            |                          |
| Archival   |                                |                      | Archival       |                            |  |            |                          |
| Remote Storage   |                                |                      |                |                            |  | 9          | Remote Storage           |
| Scale: = 1 day   |                                |                      |                |                            |  | = 1 day    | Scale:                   |
| Bob's workflow, for one job How can we get him to tell us what he's doing  | im to tell us what he's doing? | ) How can we get him | w, for one jok | Bob's workflow, for one id |  |            |                          |
|  |                                |                      |                |                            |  |            |                          |

#### Can we develop a model of his entire experiment?

- His experiment fits into a common pattern
  - Initial data transfer, then a sequence of compute jobs with some analysis/post-processing and archival at each step.
- A common set of parameters:

| Experiment Parameters        | System Parameters       |  |  |
|------------------------------|-------------------------|--|--|
| Input Data Size              |                         |  |  |
| Number of Jobs               | Network Bandwidth       |  |  |
| Compute time per job         | Ou cu co vu cit time c* |  |  |
| Output size per job          |                         |  |  |
| Analysis time per job        | Collema votoo*          |  |  |
| Compute/Archive Systems Used |                         |  |  |

# Can we use simulation to predict the effects of a change?

- A discrete event simulator
- Verifying Bob's workflow:
  - His time prediction with current queue wait times: "greater than six months"
  - Our simulator predicted bounds of 27-29 weeks, or 6-7 months
- Does Bob need this?
- Does anyone else need this?

What-ifs: dedicated run vs faster system with no network



### How have we helped?

- Generated a conceptual model of HPC workflow
- Used the model to get quantitative characterizations of Bob's workflow
- Used characterization to parameterize a simulation of Bob's experiment
- Accurately simulated whole-experiment turnaround time for multiple situations
  - Giving him a way of saying exactly how much time could be saved by dedicated runs
- What else can we use this information for?
  - Simulate entire workloads to evaluate total impact of policy decisions
  - Evaluate experiment throughput of current systems
  - Potentially map experiments to best groups of systems