# **Elastic Cloud Computing in Pharmacometrics:** Usage Data and Strategies for Efficient Workflows

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# OBJECTIVES

- Quantify Amazon Elastic Cloud Computing (EC2) usage patterns for a group of M&S scientists
- Estimate Amazon EC2 usage patterns for groups of up to 64 users
- Summarize strategies for effective use of Amazon EC2 resources for pharmacometric analyses

### BACKGROUND - Current State of Computation for Modeling and Simulation (M&S)

• The extent and complexity of computation required for model-based drug development applications continues to intensify, while pressure mounts to shorten R&D timelines.

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# RESULTS





- Software and algorithms continue to develop, but often times, computational requirements are more intensive for advanced methods (e.g. MCMC, SAEM)
- Amazon EC2 offers an almost unlimited amount of computing power. However, optimal usage of EC2 requires a good understanding of the relationship between EC2 availability/resources, modeling strategies, and scientist teams

# BACKGROUND - Typical Usage of Pharmacometrics Software with Cloud Computing

- Validated software (in this example: NONMEM<sup>®</sup>, OpenBUGS, and R) installation, and OS reside on a virtual machine image
- Each scientist in a group is responsible for spinning-up their own cloud-based cluster (Figure 1)
  - Can include multiple cores with same machine image, on as-needed basis
  - Cluster is up only intermittently e.g. on the day(s) of any analysis work, and then shut down



#### Figure 2: Usage pattern for 1, 14, and 64 users

#### Phase 2/3 Dose/Regimen Selection & Development Strategy on **Elastic Cloud**



#### BACKGROUND - Scalable Pharmacometrics Platform in the Cloud



#### **Production Module**

**Workflow involves transactions** with project source control server (the repository)

**User EBS volume workspace** 

Projects are launched by individuals, from workstations, all over ssh

User-initiated grids using a StarCluster AMI base image

Scalable to >100 instances

**Figure 1:** Scalable Pharmacometrics Platform in the Cloud

### METHODS - Cloud Usage

# **Determination of EC2 usage patterns (Figure 2)**

• Usage patterns for 1 scientist and a group of 14 M&S scientists over a six month time

#### **Figure 3:** *Resource optimization for pharmacometric project*

BENEFITS AND CHALLENGES - Resource Optimization	
Benefits	Challenges
•Timely, efficient completion of project	• Requires good communication and teamwork
<ul> <li>Modeling and simulation not limited by compute resources</li> </ul>	<ul> <li>May require revised workflow when moving into cloud</li> </ul>
• Allows for parallelization at three levels (run, simulation replicate, team member)	<ul> <li>Upfront planning of tasks and resources (scientists and computing resources)</li> </ul>

- period were captured to assess sustained and peak usage.
- Actual data from 14 users were used to simulate, via resampling, the usage pattern for a group of 64 users.

## METHODS - Pharmacometric Project

# Summary of actual pharmacometric project (Figure 3)

- Modeling of three endpoints requiring numerical integration of differential equations
- Simulation-based evaluation of Phase 2 and 3 trial design options
- Utilized parallel processing at 3 levels: within-run, across trial simulation replicates, across project objectives by 6 individuals on the M&S team

# CONCLUSIONS

- Usage patterns for EC2 and associated software resources, were characterized by peaks and valleys in utilization over time.
- EC2 and software utilization were proportional to the number of users, not maximum number of available cores.
- EC2 virtually eliminated computation time from the critical path for completion of the typical pharmacometrics project.
- Team-based project strategies, with parallel task and computation implementation, maximize the potential utility of EC2 for pharmacometrics workflows.

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