

Lightweight Scheduling for Grid Applications

A. Lazarevic and L. Sacks



Outline

- Motivation
- Methodology
- Observed user behaviour
- Prediction Strategy
- Conclusions

Better Grid Scheduling

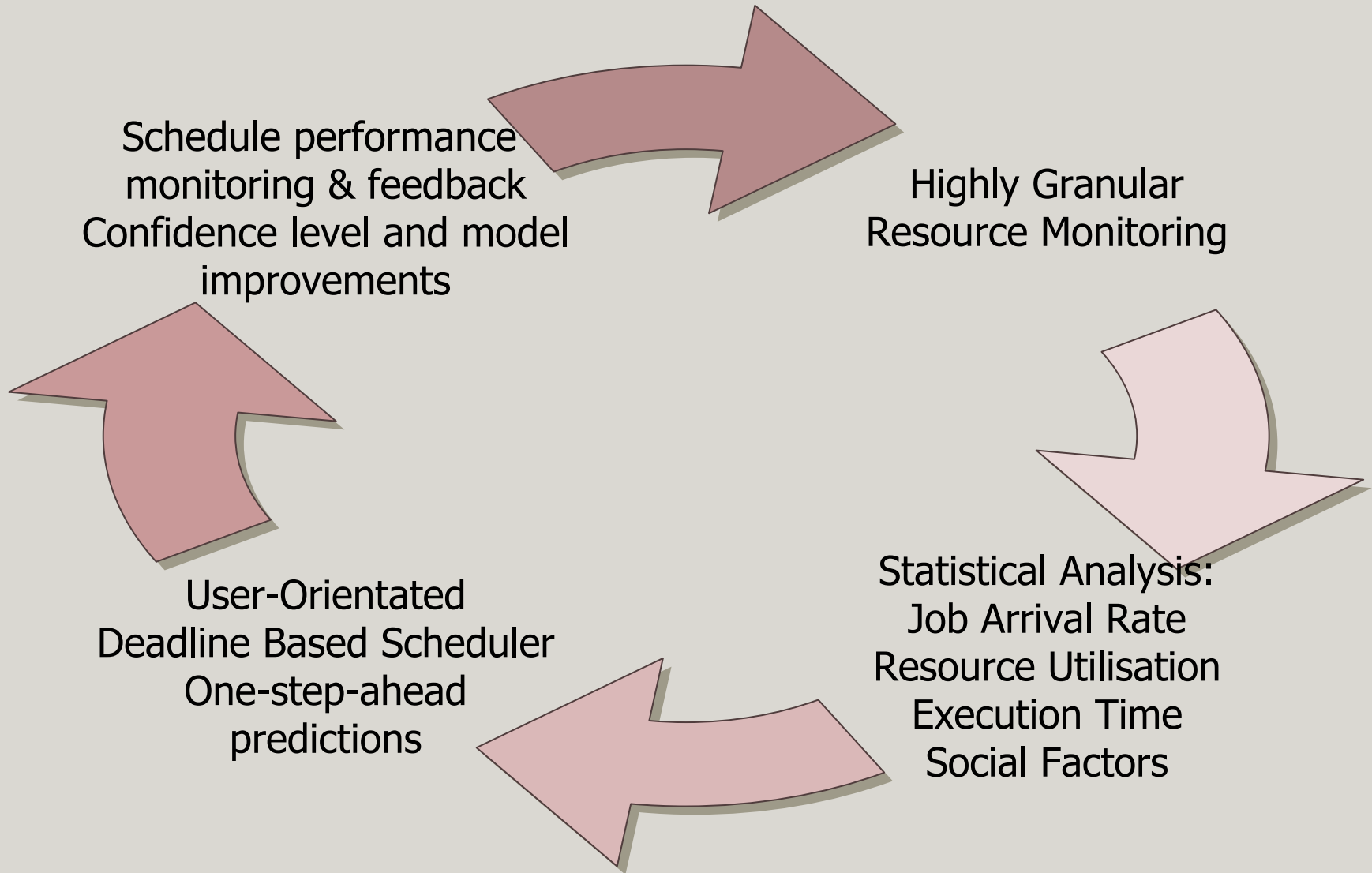
- Deadline based
- Transparent to the user
- (mostly) Self-managing
- More effective
 - Out-of-Order execution
 - Priority replaced with confidence level



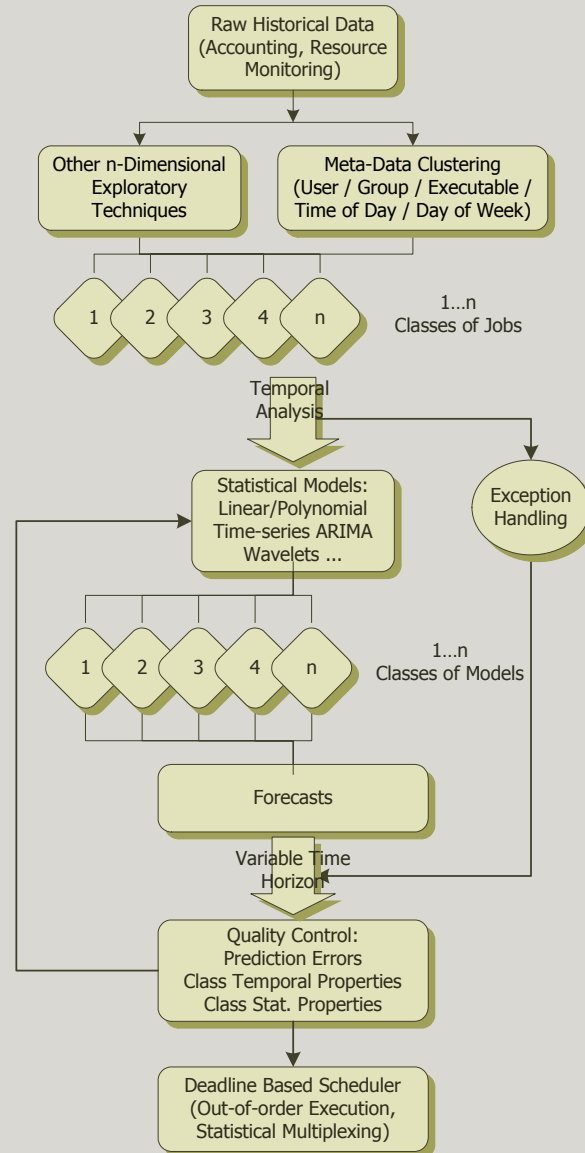
If only...

- We knew...
 - Process' execution time
 - Resource utilisation
 - Likelihood of a similar process arriving
 - Our confidence in these numbers
- We could...
 - Be flexible & robust
 - Treat anomalies in the same way as reg data
 - Adapt to change in circumstance & prediction quality

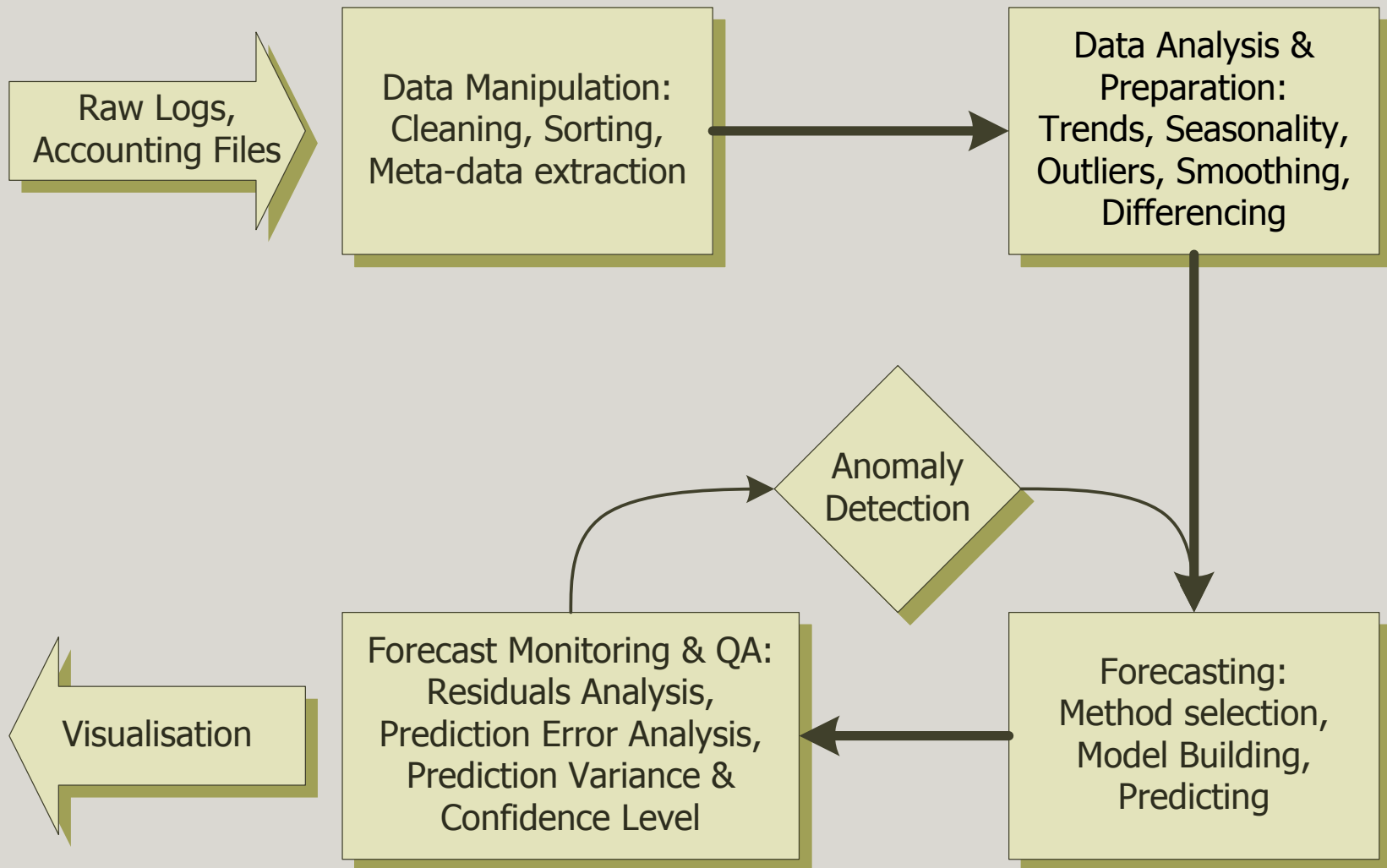
Methodology



Methodology



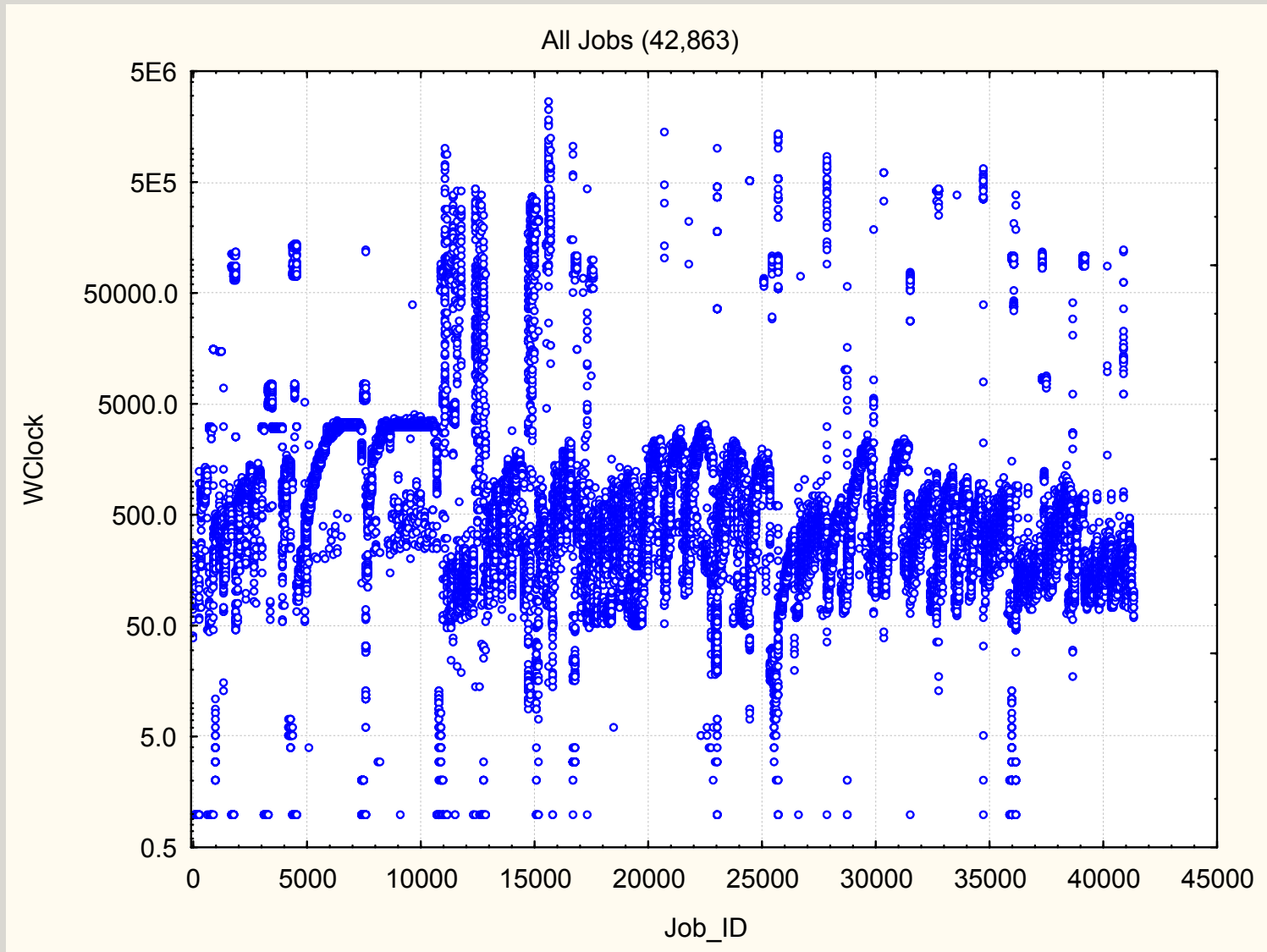
MATLAB Framework



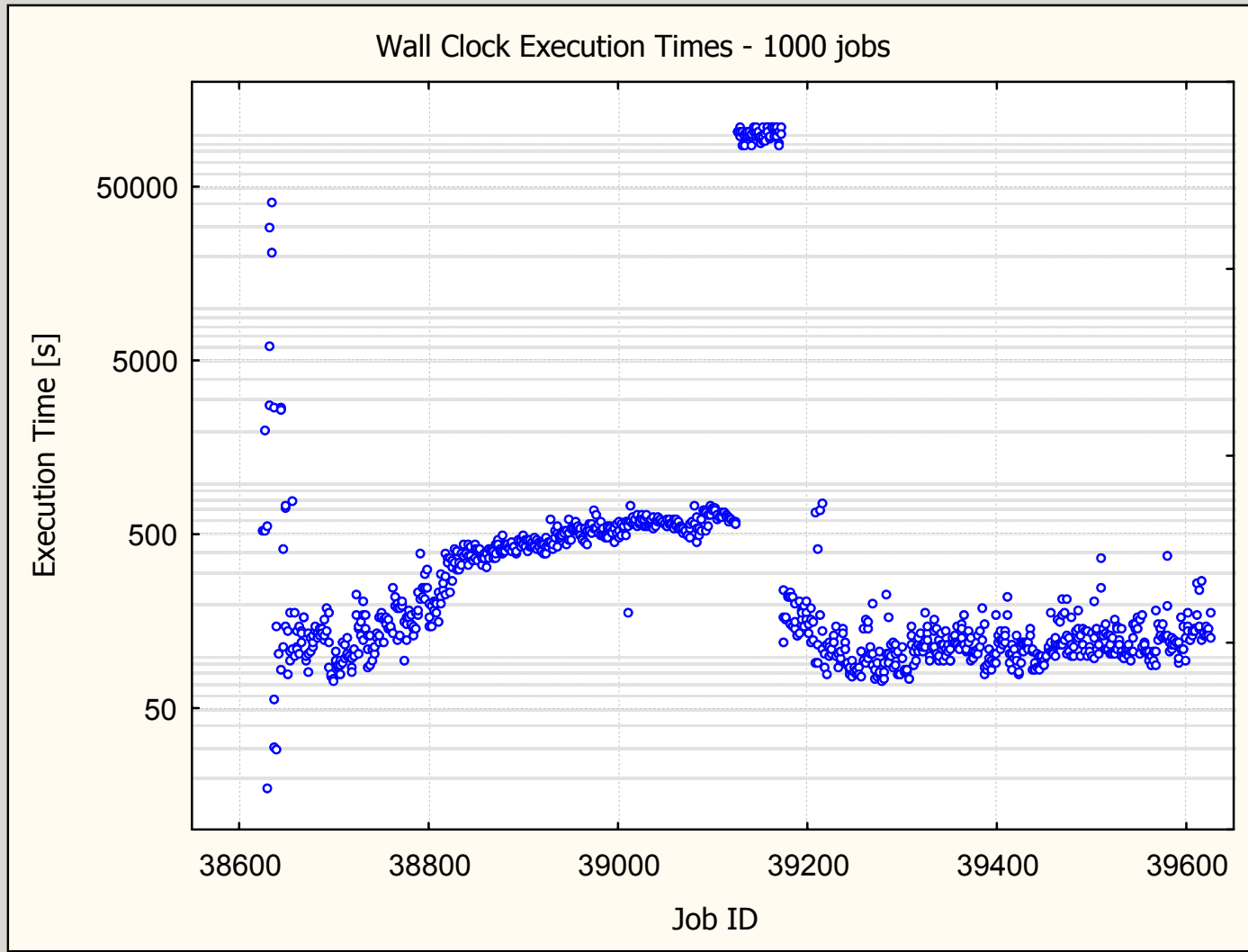
Preliminary Data Analysis

- Data Source:
 - 200 CPU Sun Grid Engine cluster @ UCL
- User community:
 - 20 UK e-Science projects
 - 5-10 different projects concurrently running
- Scope:
 - 50,000 jobs (>5,500 CPU days)
 - Jul 2004 – Dec 2004

Trivial Approach – All In



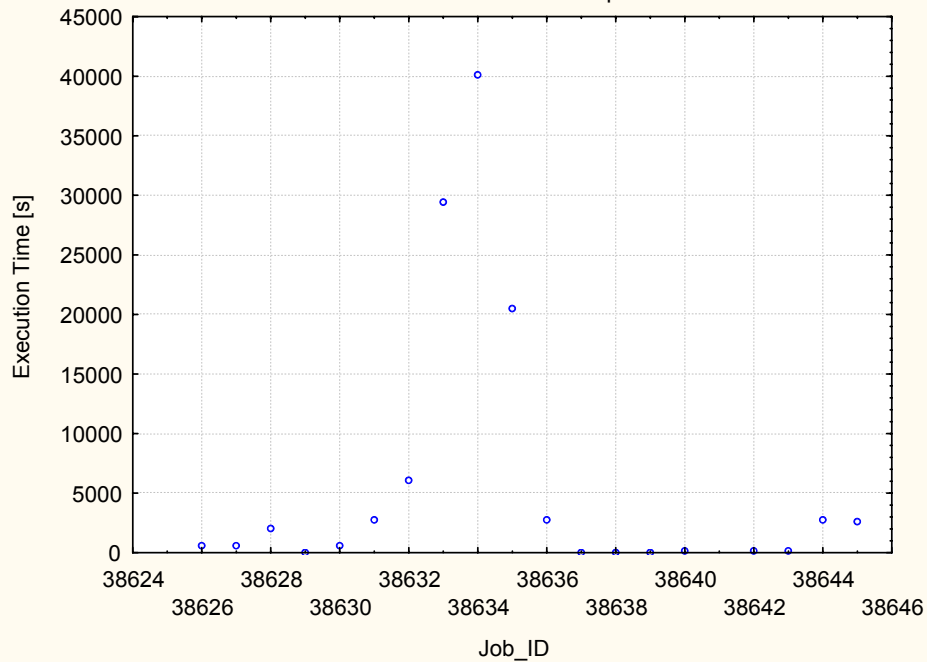
Temporal Job Selection



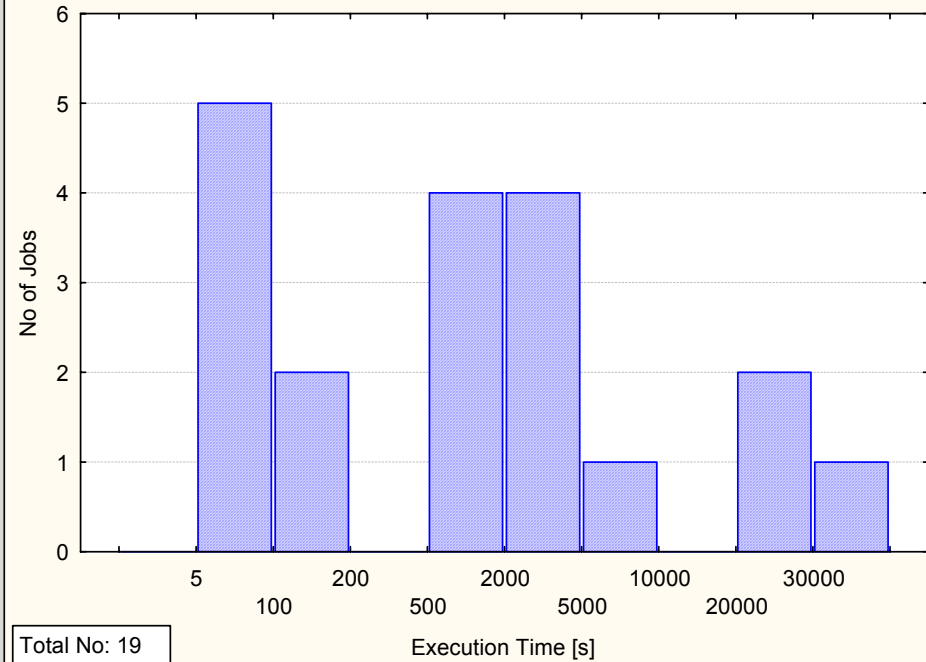
1000 Jobs, 15 hours of total execution time, used in all following analyses

Intra-Group Analysis – *ocotir*

Execution Time - ocotir Group

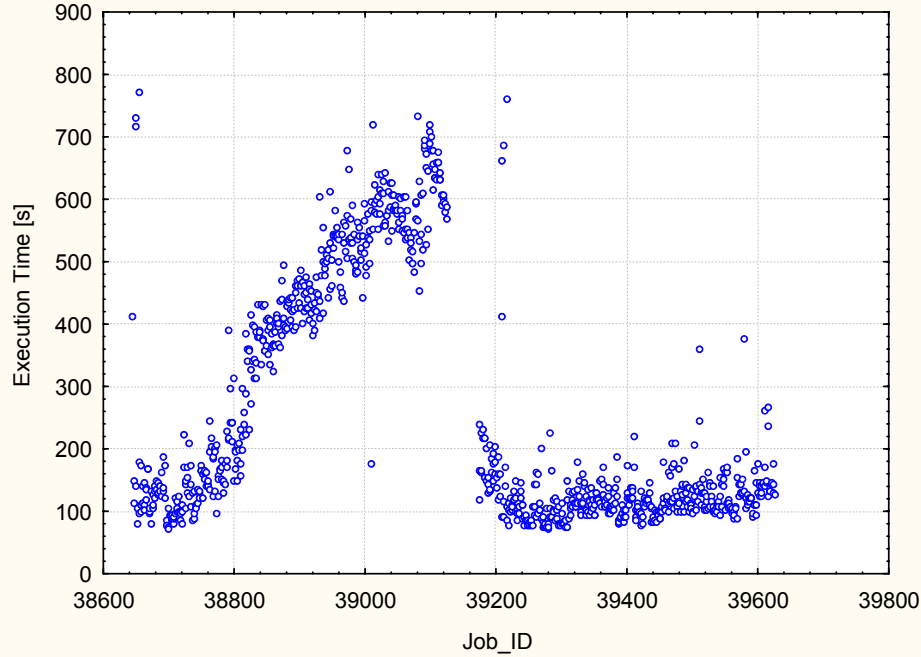


Execution Time Histogram - ocotir Group

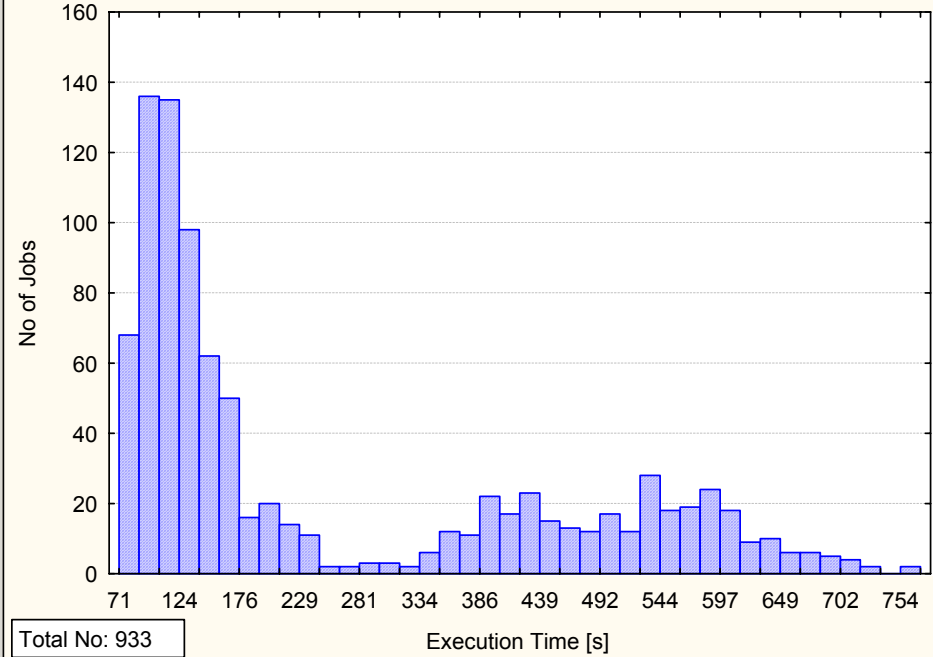


Intra-Group Analysis – *matsim*

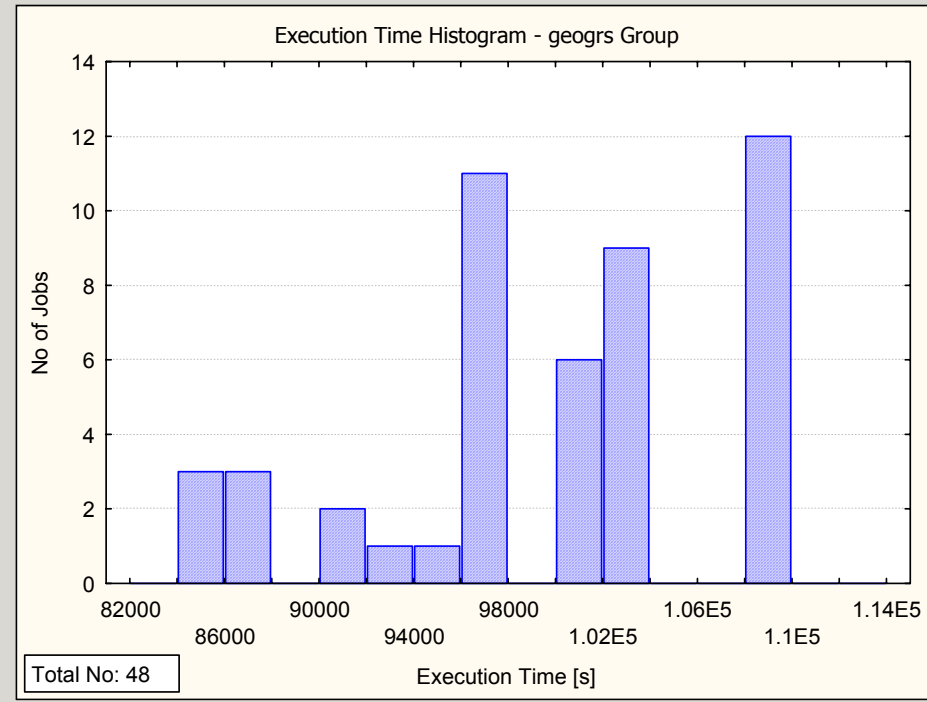
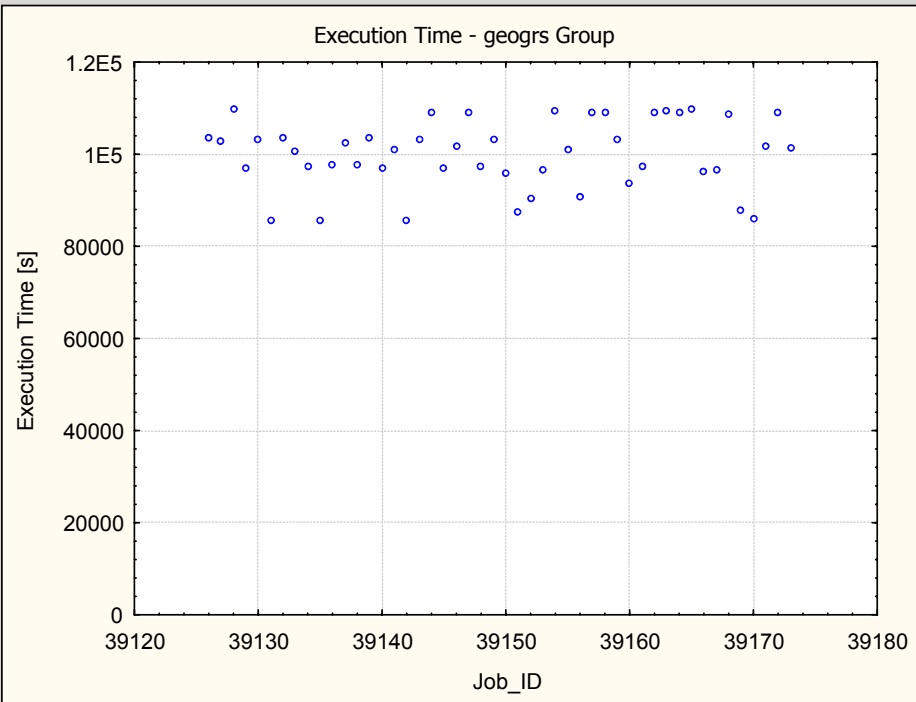
Execution Time - matsim Group



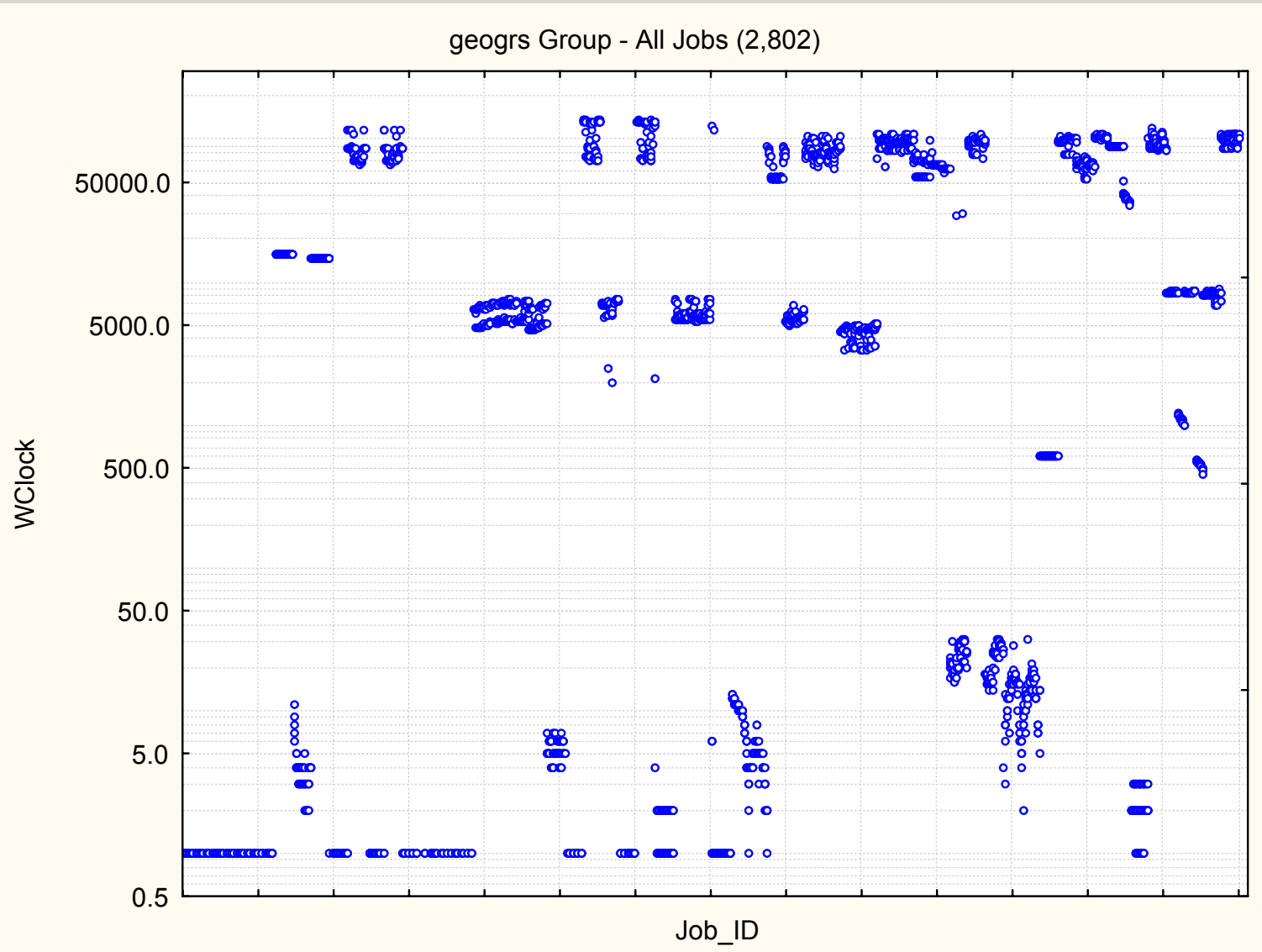
Execution Time Histogram - matsim Group



Intra-Group Analysis – *geogrs*



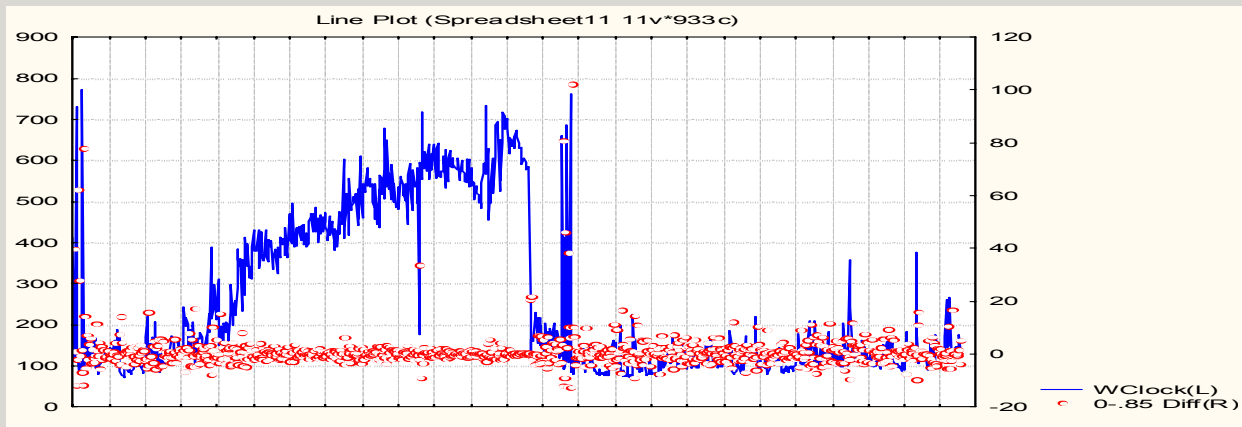
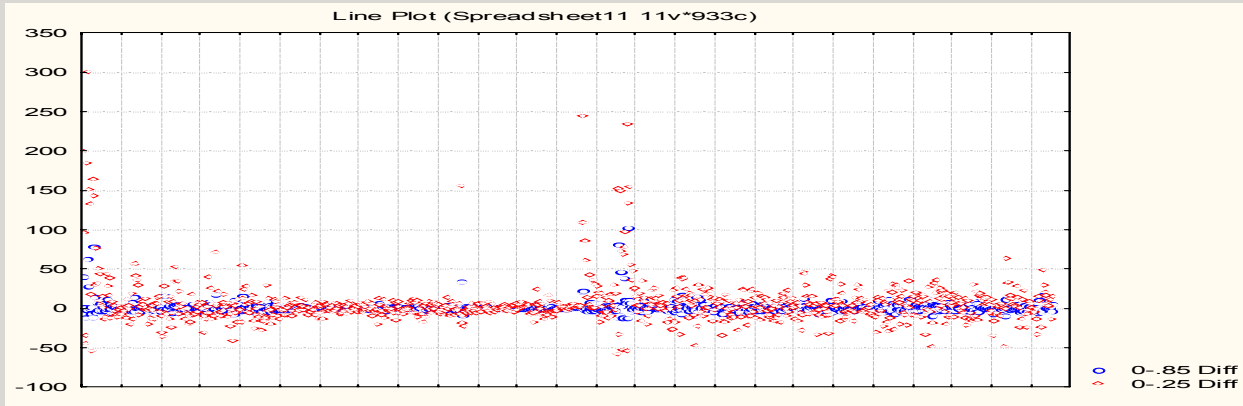
Temporal Locality?



Anomalies

- Detect sudden, significant and sustained changes in the quality of predictions
- Detecting them
 - Using a self-tuneable system
 - Flexible definition of an anomaly
- Dealing with them
 - Shorten the prediction horizon
 - Reduce the confidence interval

Anomaly Detection - Exp Smoothing

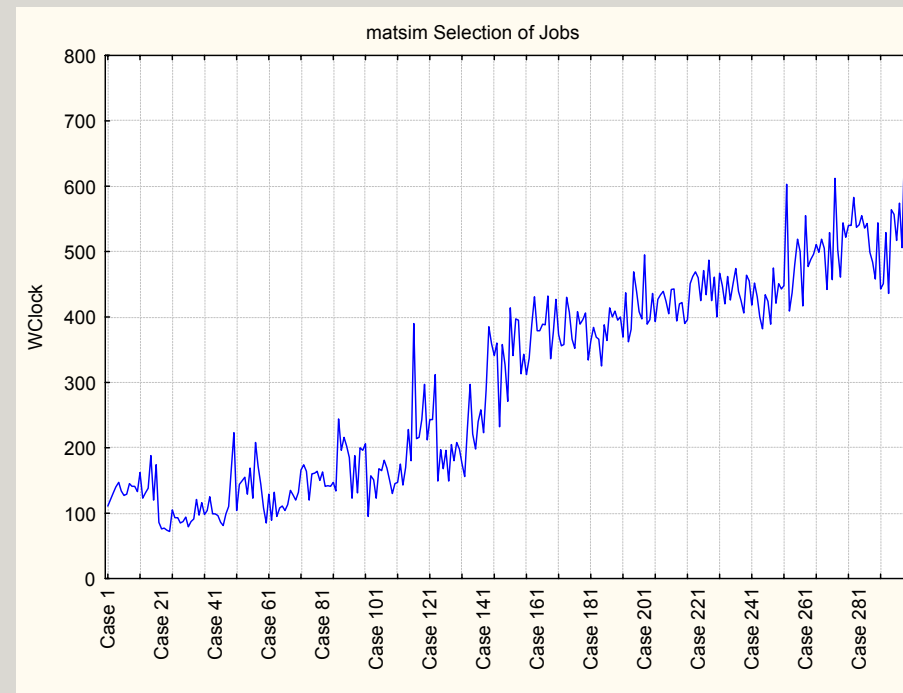
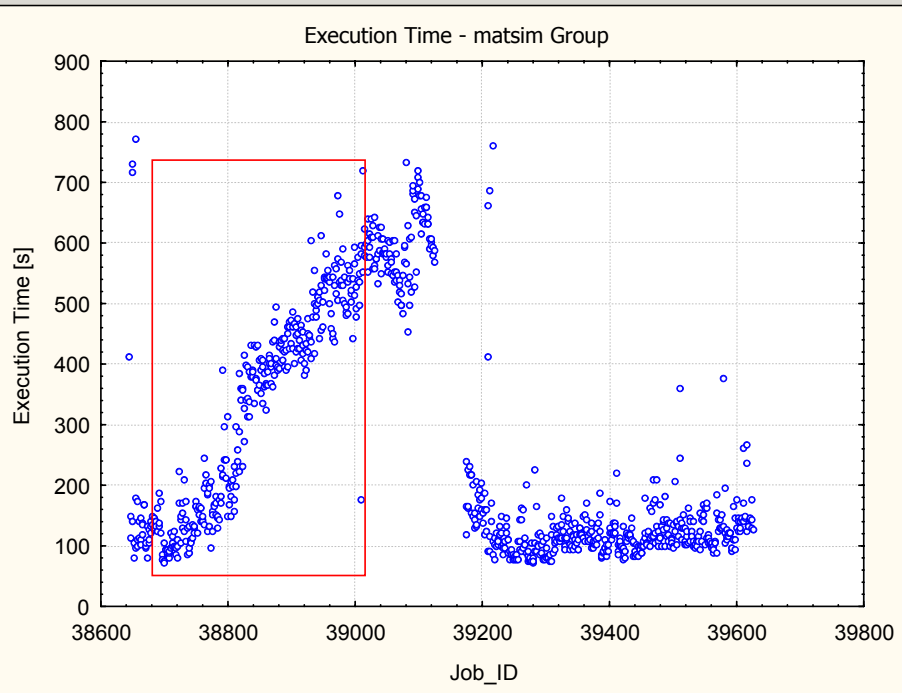


Prediction Methods

- Trend prediction (linear, polynomial...)
- Time-series
 - Exponential Smoothing (Holt, SES, etc)
 - Autoregressive & Moving Average
 - ARIMA (Box-Jenkins)
- Bayesian Statistics
- Wavelets
- “All models are wrong, but some are useful”

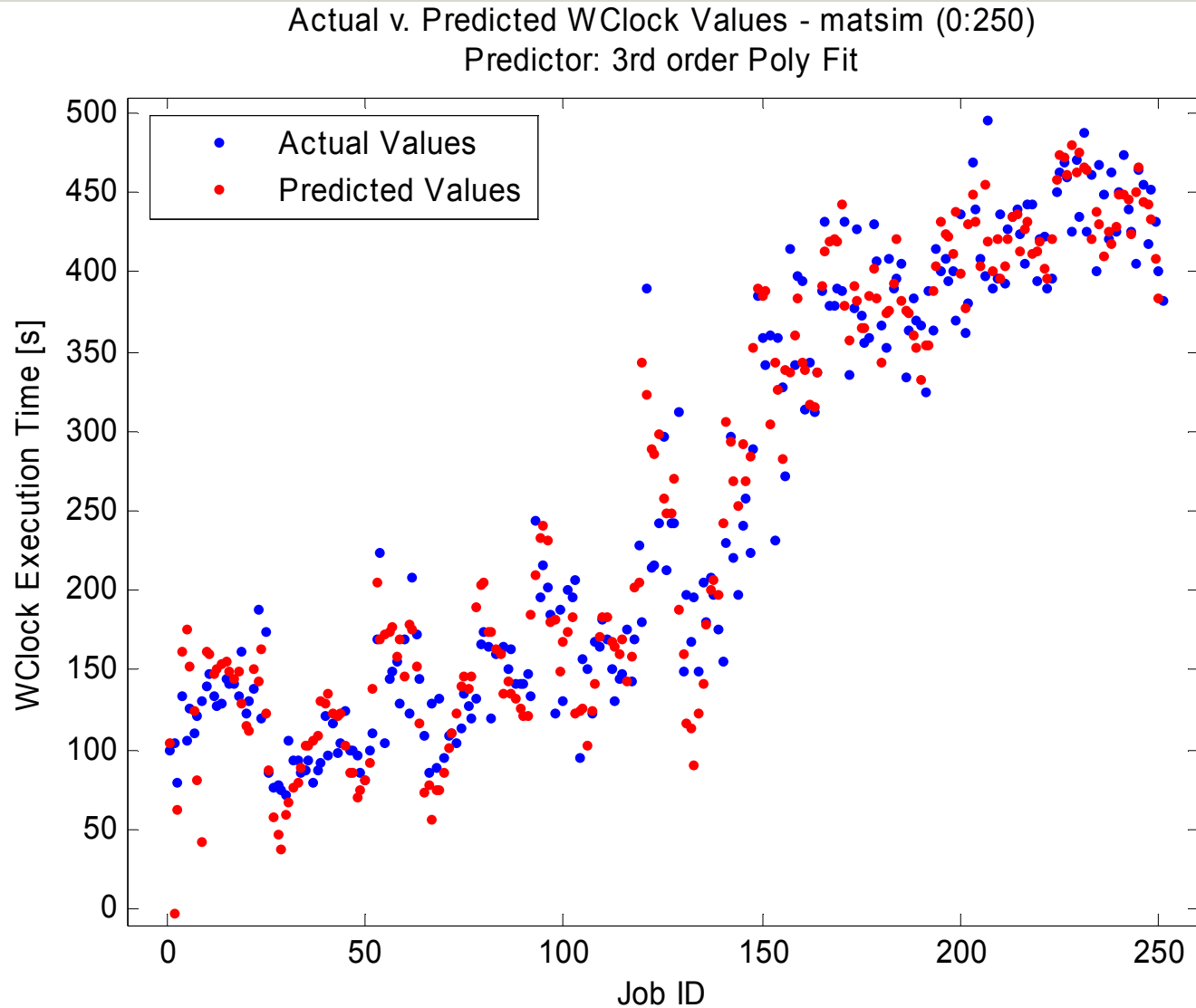
George E.P. Box, Professor Emeritus

Forecasting

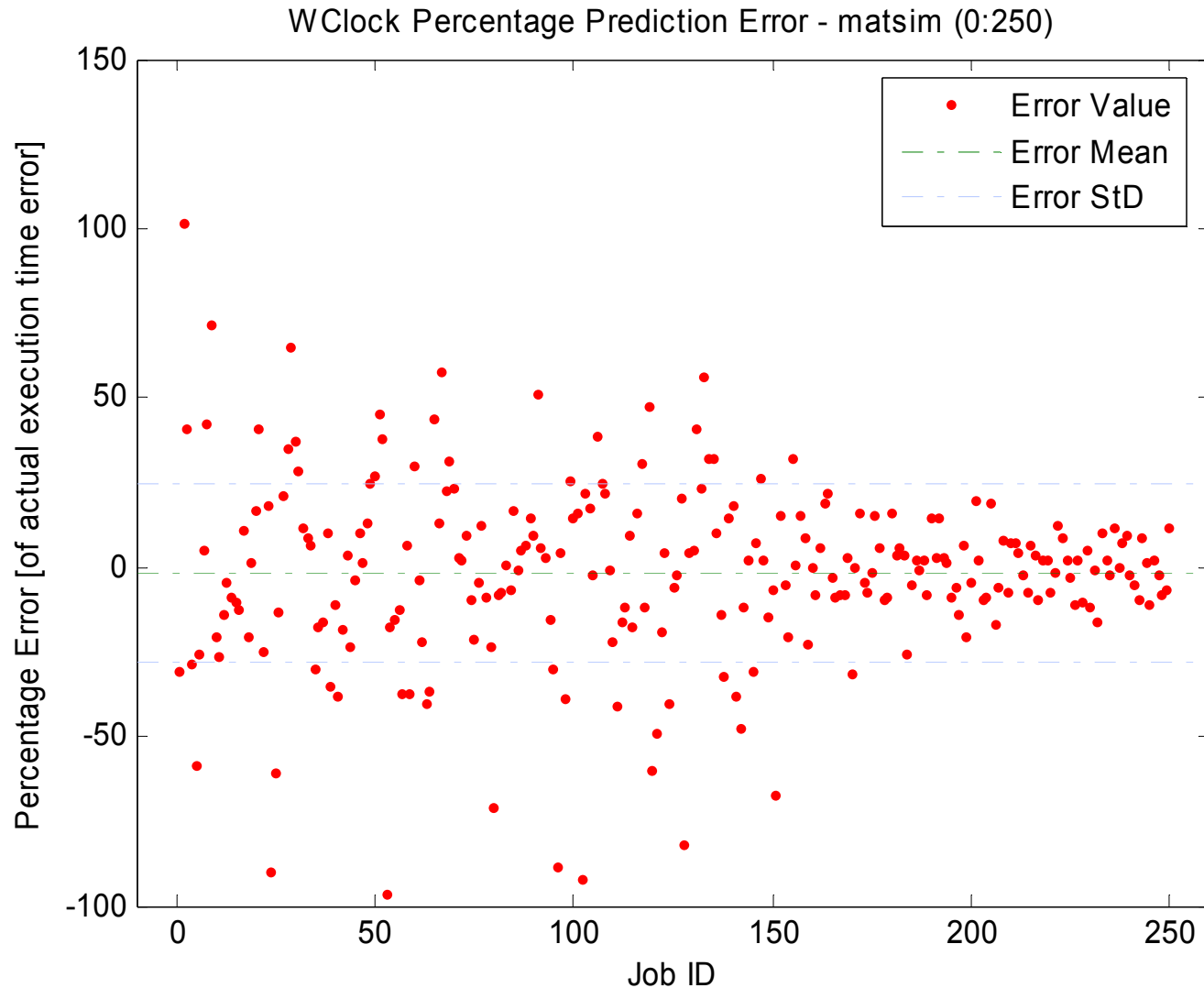


- Forecasting method analysis done on a subset of *matsim* jobs (highlighted)

Trend Based Predictions – *matsim*



Trend Based Predictions – *matsim*



Conclusions

- Clear and pressing need for better Grid scheduling
- Patterns do develop in Grid utilisation
- These patterns vary between “groups”, and in time
- User-independent predictions with reasonable accuracy are possible
- Impact to the Grid utilisation, job workflow and administrative policies may be significant