## Using the Amazon Compute Cloud to Analyze Large Data Sets

The Panchromatic Hubble Andromeda Treasury

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## Ground Based Image

Movie by Anil Seth

## Hubble field of view is small



# Coverage in 3 Cameras



Characterizing all star types requires ultraviolet optical and infrared measurements

#### WFC3/IR + WFC3/UVIS

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#### WFC3/IR + WFC3/UVIS

ACS



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## 6-Filter HST Tiling of M31



# Outline

- Pipeline Architecture
- Challenges and solutions for running on the Amazon Cloud (EC2)
- Necessary improvements for larger data sets.
- Example application: M31 HST Survey

# Pipeline Goals

- Break down data reduction into many individual tasks.
- Run tasks on lots of data in parallel.
- Group data to optimize measurements
- Efficient to reduce same data multiple ways.
- Chain of tasks can be restarted from any point of failure

## **Pipeline Architecture**



Can branch off separate reduction with different parameters at any point

## Cluster Computing



# Why Move to EC2?

- Root privileges for installing and maintaining software
- No end-of-life/contract problems
- Scaling up or down based on data amounts
- Easy to change machine specifications
- Minimal unscheduled down time (hackers, upgrades, failures)
- Amazon Research Grants

## EC2 Computing



# Initial Challenges

- Security: launch instances through DB server
- Disk storage: separate for each instance
- All data on Instances vanishes when they are terminated
- Job queuing and node selection done by server

# Security

- Only allow instances to be passed a single number (the event code)
- Nodes only let single number through the firewall.
- Node then initiates a connection to the server -- more complex information can be exchanged.



# File Handling

- Each file's metadata is entered into the DB
- A copy of each file is put on S3
- When a file is requested, server syncs S3 and node to the newest version
- Requires careful scripting



# Tools Produced

- Automating start up multiple nodes with a single command to the database
- Web interface to keep track of which nodes are doing which jobs, as well as finding, and fixing failures
- Task launching regulated and coordinated across nodes
- File synchronization across many nodes through S3.

peline1.astro.washington.edu/pipelines/794?showTree=1 - / Evenu 144134): completed Event(144127): "unsorted image" Job(85422): completed (node 3182 deleted) : for Task(15386): build/pipe\_2.2/tag\_image.pl - U Event(144135): "done\_tagging" Job(85423): completed (node 3182 deleted) : for Task(15377): build/pipe\_2.2/astrodrizzle.pl Event(144139): "astrodrizzle\_done Job(85425): completed (node 3182 deleted) : for Task(15393): build/pipe\_2.2/find\_reference.pl Event(144141): "tagged reference" Job(85426): completed (node 3182 deleted) : for Task(15376): build/pipe\_2.2/get\_galaxy.pl Event(144144): "galaxy retrieved" Job(85429): completed (node 3182 deleted) : for Task(15366): build/pipe\_2.2/make\_overlays.pl Event(144153): completed - U Event(144146): completed Job(85427): completed (node 3182 deleted) : for Task(15385): build/pipe\_2.2/count\_images.pl - / Event(144143): "prep" Job(85428): completed (node 3182 deleted) : for Task(15374): build/pipe\_2.2/prep\_image.pl Event(144156): completed Event(144145): "prep" + JJ Job(85430): completed (node 3182 deleted) : for Task(15374): build/pipe\_2.2/prep\_image.pl Event(144157): completed Event(144147): "prep" Job(85431): completed (node 3182 deleted) : for Task(15374): build/pipe 2.2/prep image.pl Event(144154): completed Event(144148): "prep" Job(85432): completed (node 3182 deleted) : for Task(15374): build/pipe\_2.2/prep\_image.pl Event(144155): completed [] Event(144149): "prep" Job(85433): completed (node 3182 deleted) : for Task(15374): build/pipe\_2.2/prep\_image.pl Event(144158): completed Event(144150): "prep" Job(85434): completed (node 3182 deleted) : for Task(15374): build/pipe\_2.2/prep\_image.pl - Event(144159): "images prepped" Job(85436): completed (node 3182 deleted) : for Task(15369): build/pipe\_2.2/shiftfind.pl Event(144162): "shifts\_done" Job(85437): completed (node 3182 deleted) : for Task(15383): build/pipe\_2.2/write\_dolphot\_pars.pl Event(144164): "parameters done" + JJob(85438): completed (node 3182 deleted) : for Task(15392): build/pipe\_2.2/run\_dolphot.pl - J Event(144192): "dolphot\_done" Job(85452): completed (node 3182 deleted) : for Task(15358): build/pipe\_2.2/phot\_fitstable.pl Event(144195): "phot fitstable done" Job(85453): completed (node 3182 deleted) : for Task(15391): build/pipe\_2.2/cull\_photometry.pl Event(144197): "culling done"

Job(85454): completed (node 3182 deleted) : for Task(15365): build/pipe\_2.2/make\_cmd.pl

# Unexpected problems

- File synchronization issues -- colliding requests.
  - More careful task scripting
- Server overload -- too many requests
  - DB indexing
  - More powerful server node
- File transfer size limits and errors
  - Increased checks that transfers succeed.
- Too expensive
  - Move to "Spot" instances

# Hourly Rates

type	memory	сри	on- demand	reserved I yr min.	typical spot
Average	8	2	0.14	0.09	0.02
more memory	15	2	0.18	0.10	0.02
more CPU	15	4	0.28	0.18	0.03
high memory	61	8	0.70	0.38	0.07
high CPU	30	16	0.84	0.51	0.13

# On demand \$0.28 per hour

#### **Spot Instance Pricing History**



# Prices can jump unexpectedly





# Continuing Improvements

- Optimizing node use (ratio of high to low memory nodes, and putting the right jobs on the right type of node).
- Still occasional communication problems, intermittent and very difficult to trace.
- Server always on... \$\$\$
- Recovery for vanishing instances.

# Improvements needed for Scaling

- automated termination of idle nodes
- automated adding of nodes (of appropriate type) when queue is long
- storing and using technical requirements for each task
- high-powered server instance (off cloud?)



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## Measure 3 cameras at once

Multiple orientations Multiple pixel scales Multiple distortions Multiple point spread functions Andy Dolphin, DOLPHOT 2.0 (http://americano.dolphinsim.com/dolphot/)



#### 8 GB of memory: \$0.2/hr

#### 60 GB of memory: \$0.7/hr

Neighboring fields aligned for catalog merging and mosaic

10000





#### F475W, F814W, F160W



#### F475W, F814W, F160W





![](_page_29_Picture_0.jpeg)

![](_page_30_Picture_0.jpeg)

# "Crowding" varies w/ Radius

![](_page_31_Picture_1.jpeg)

![](_page_31_Picture_2.jpeg)

## Bulge

## Outer Disk

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![](_page_32_Figure_0.jpeg)

![](_page_32_Figure_1.jpeg)

![](_page_33_Figure_0.jpeg)

Optical-IR Main sequence Red Giant Branch Asymptotic Giant Branch Bump Red Clump

![](_page_33_Figure_2.jpeg)

## Clusters (HST vs Ground) HST

![](_page_34_Picture_1.jpeg)

HST \*

![](_page_34_Picture_3.jpeg)

![](_page_34_Picture_4.jpeg)

![](_page_35_Picture_0.jpeg)

2270 Background Galaxies

Andromeda Project Catalog: Johnson et al., submitted

6x increase in number of known clusters within PHAT footprint.

![](_page_36_Figure_1.jpeg)

Catalog complete down to 500 M<sub>☉</sub> for ages <100 Myr.

#### Young clusters probe Initial Mass Function

![](_page_37_Figure_1.jpeg)

D. Weisz et al., submitted

## Initial Mass Function

![](_page_38_Figure_1.jpeg)

D.Weisz et al., submitted

## Red Giant Branch Sensitive to Extinction

![](_page_39_Figure_1.jpeg)

FII0W-FI60W CMD of Single WFC3/IR frame, subdivided in 4x4 grid

![](_page_39_Figure_3.jpeg)

March 11, 2015

![](_page_40_Figure_0.jpeg)

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![](_page_41_Figure_0.jpeg)

# Map of the Dust

![](_page_41_Figure_2.jpeg)

Residual structure: 1.5% flat fielding errors in WFC3/IR!

# Excellent Consistency with Dust Emission

![](_page_42_Picture_1.jpeg)

## Choose dust-free locations

![](_page_43_Figure_1.jpeg)

# Group into radial bins

![](_page_44_Figure_1.jpeg)

![](_page_45_Figure_0.jpeg)

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## Bernard et al. 2015: Outer disk

![](_page_46_Figure_1.jpeg)

#### Power of 6 bands

Spectral energy distribution

Temperature, gravity, metallicity, intervening dust properties

![](_page_47_Figure_3.jpeg)

## Derive True H-R Diagram

![](_page_48_Figure_1.jpeg)

Gordon et al. in prep

## Public Release

http://archive.stsci.edu/prepds/phat/

I I 7 million stars Paper reference: Williams et al. 2014, ApJS, 215, 9

## Collaborators

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