



# Autonomous Targeting of Geochemical Measurements on Mars

1st Swiss Workshop on Machine Learning for Environmental and Geosciences

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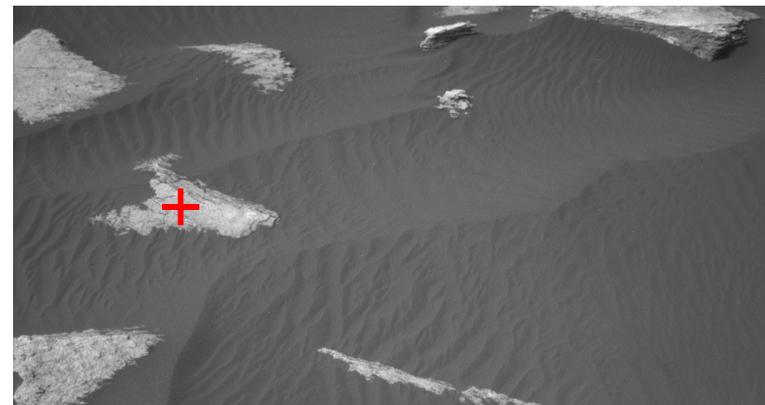


**Jet Propulsion Laboratory**  
California Institute of Technology

# Introduction to AEGIS

## AEGIS is:

- An **intelligent software** system
- Running since 2016 **on-board** the *Curiosity* rover
- **Autonomously choosing science targets** and measuring them with the ChemCam laser spectrometer instrument
- Favoring targets based on **scientists' preferences**
- Regularly, reliably interpreting **complex natural scenes**
- **Consistently performing well** even in unexplored terrain



# AEGIS Intelligent Targeting System

**“Automated Exploration for Gathering Increased Science”**

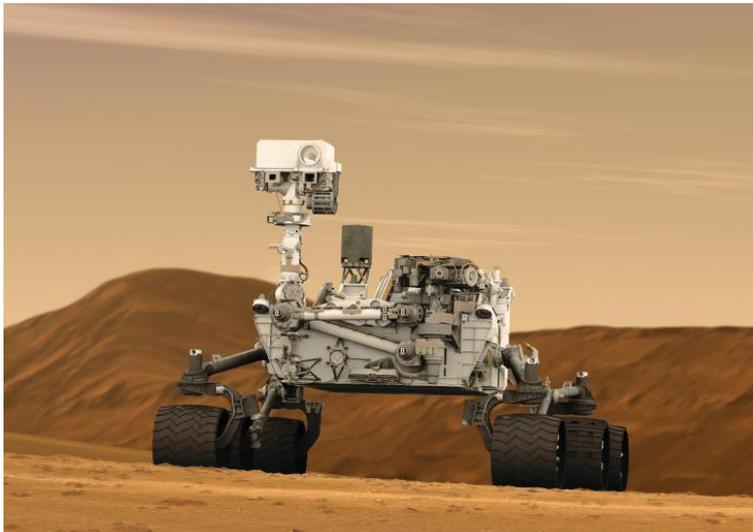
**AEGIS was first flown on MER Opportunity in 2010**

- Autonomous target selection for PanCam

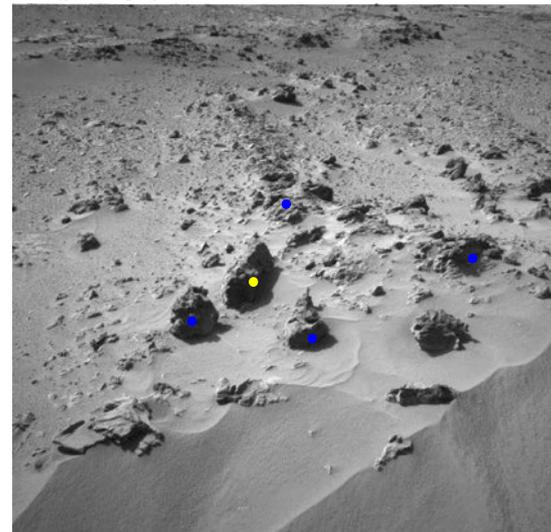


**Now in use for ChemCam on MSL since 2016**

- Autonomous target selection in NavCam images for ChemCam

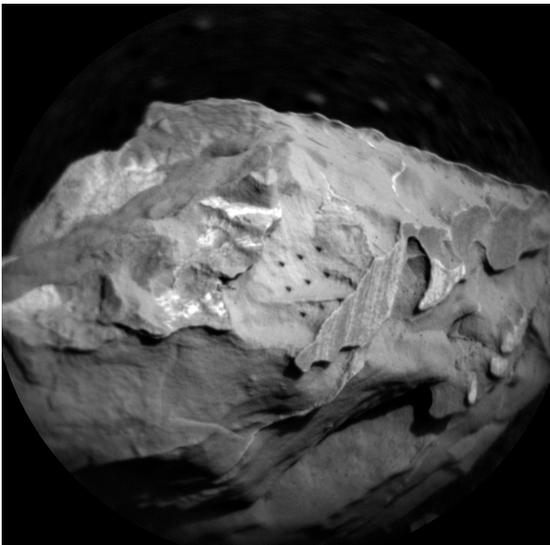


***NavCam***



# ChemCam Instrument

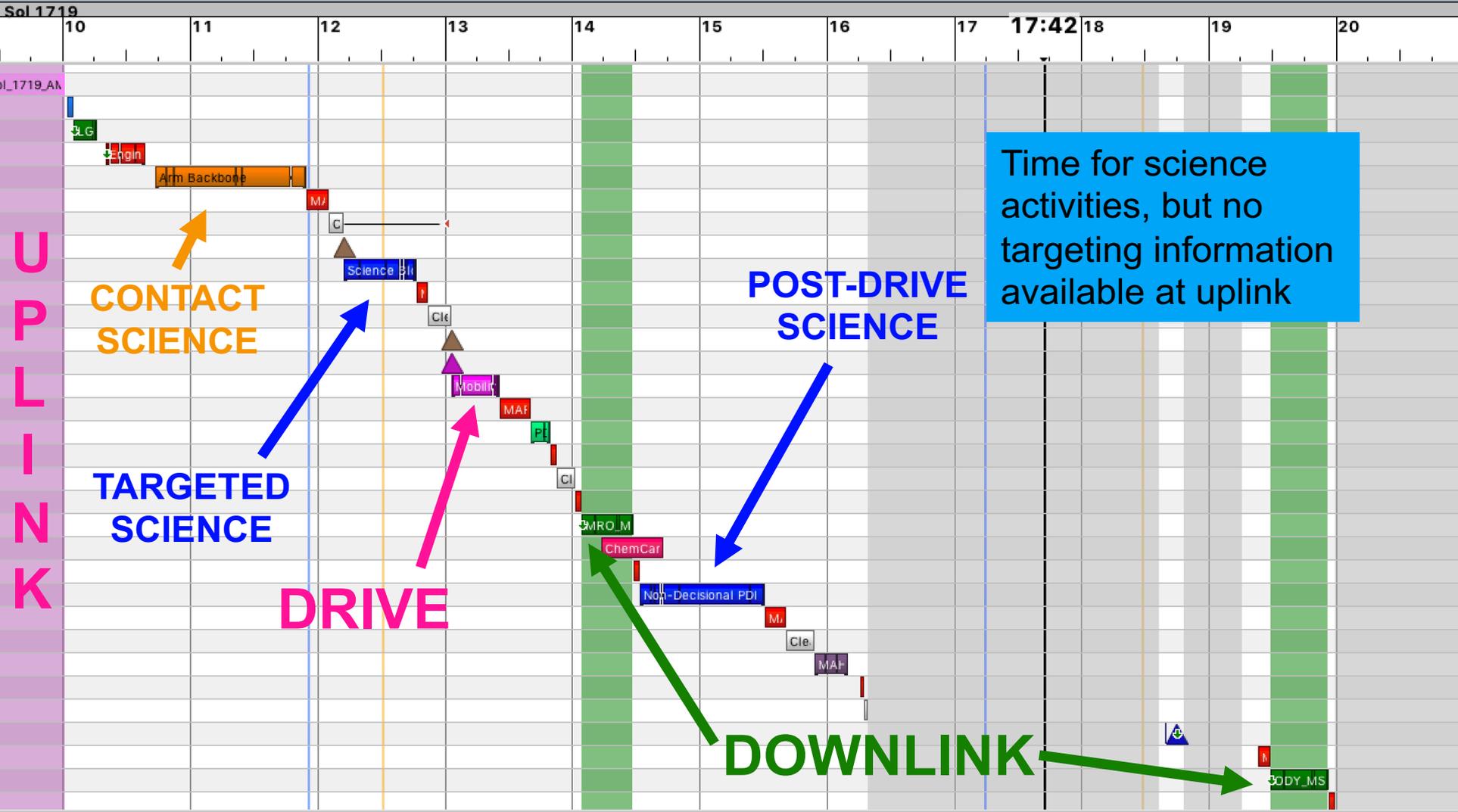
- Laser-Induced Breakdown Spectrometer (LIBS) with Remote Micro-Imager (RMI)
- Gives geochemical composition of rock targets at ranges up to 7 meters
- Over 600,000 measurements on 1700 targets on Mars since 2012
- Joint development of
  - Los Alamos National Laboratory (LANL, Los Alamos)
  - Institut de Recherche en Astrophysique et Planétologie (IRAP, Toulouse)



# Why do we need autonomous targeting?

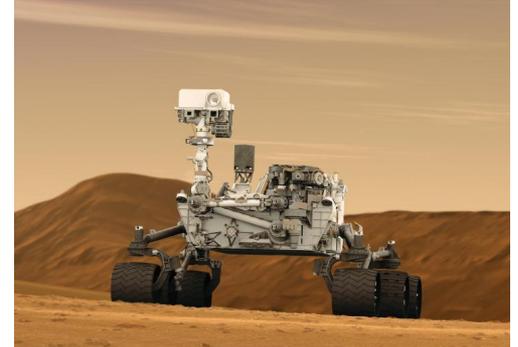
## A (simplified) typical day on Mars

Sol 1719: Planned on 6 June 2017



# Deployment Challenges

- *Curiosity* hardware and software **complexity**
- New **safety constraints** compared to MER
  - Sun-Safety (“Don’t look at the sun!”)
  - Collision (“Don’t shoot the rover!”)
- Limited **onboard memory**
  - 256 MB of DRAM, 128 MB of RAM – AEGIS limited to **16MB**
- Flight processor: RAD750 @ **133 MHz**
  - AEGIS runtime: 2-5 minutes
  - Stereo information on targets is time consuming



# AEGIS deployment & Ops team

AEGIS deployment relied on AEGIS, MSL, and ChemCam teams:

- **AEGIS**

- Tara Estlin (AEGIS PI)
- Daniel Gaines
- Raymond Francis
- Gary Doran
- Vandí Verma
- Benjamin Bornstein
- Michael Burl

- **And of course:**

- Larger AEGIS development team
- ChemCam ops personnel
- MSL engineering ops team
- MSL science ops team

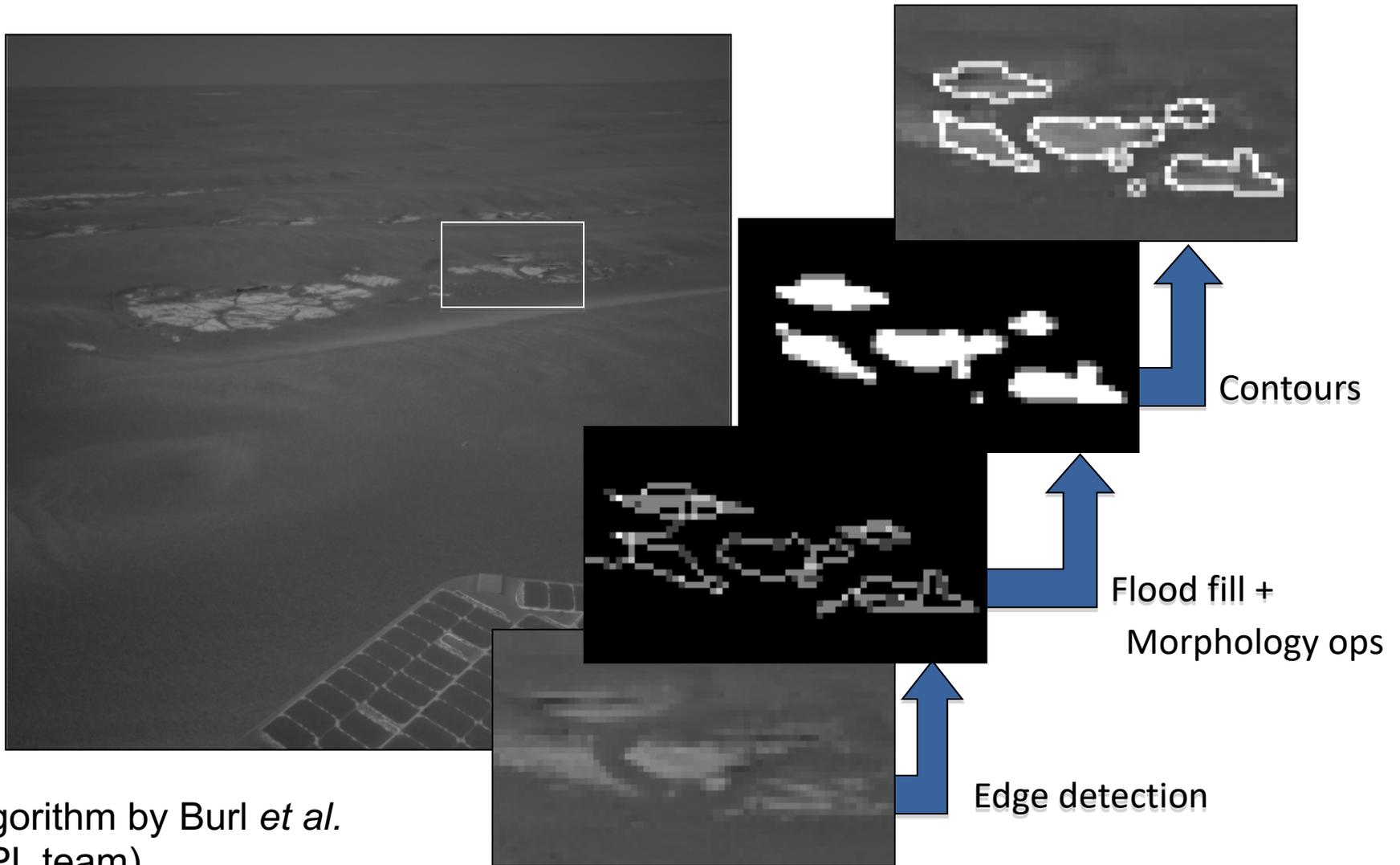
- **ChemCam**

- Roger Wiens (ChemCam PI)
- Steven Johnstone
- Suzi Montaña
- Olivier Gasnault
- Laurent Peret
- Eric Lorigny
- Diana Blaney
- Jens Frydenvang
- Valérie Mousset

- **MSL**

- Deb Chattopadhyay
- Betina Pavri

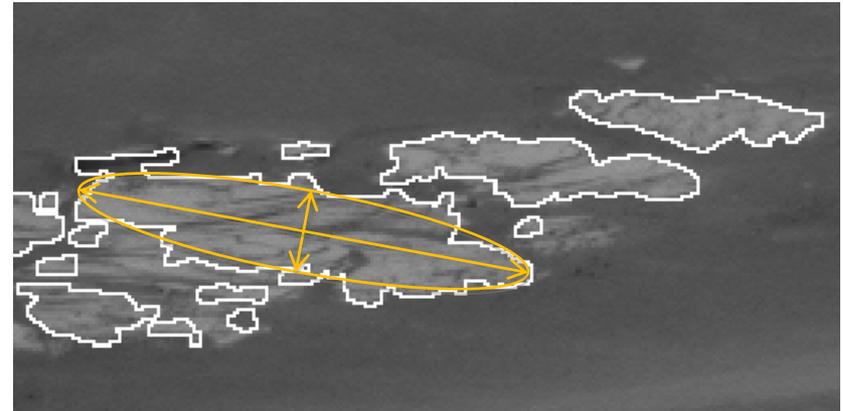
# AEGIS Target Detection using ROCKSTER



# Target Property Evaluation

## Size

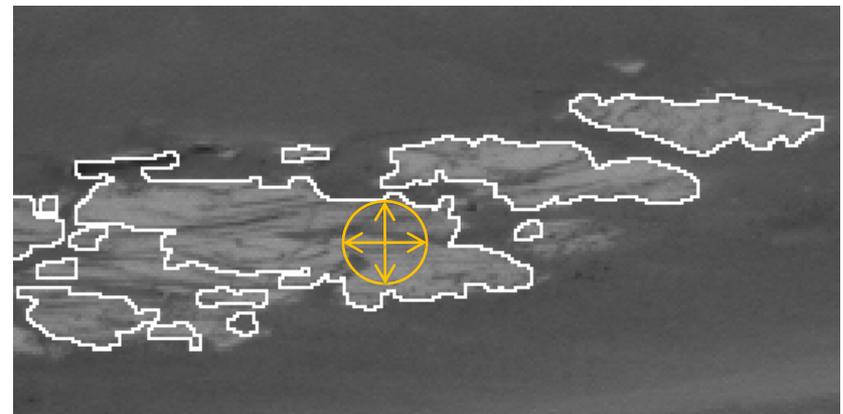
- Number of pixels
- 3D estimate (from stereo)
- Ellipse semi-major axis
- Ellipse semi-minor axis



Ellipse fit example

## Position

- Distance from rover
- Inscribed circle x, y
- Site x, y, z
- Site az, el



Inscribed circle example

# Target Property Evaluation

## Intensity

- Mean
- Variance

Light

Dark



## Shape

- Eccentricity
- Ellipse fit error
- Ruggedness
- Orientation



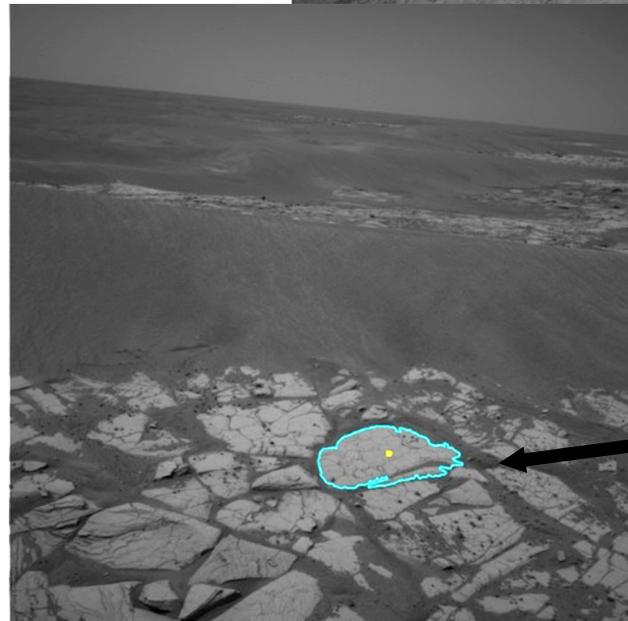
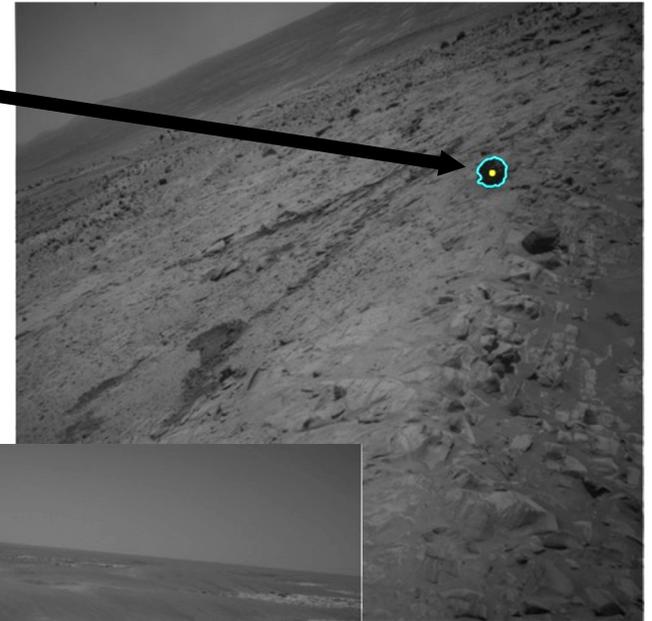
Rounded

Angular

# Target Prioritization

- Scientists can prioritize different property values
  - Single or combinations
  - e.g., prefer large, high albedo rocks
- Property setting is done at command sequencing
- Can be easily changed as rover enters different terrain areas
- Can support specific mission campaigns
  - e.g., cobble finder, outcrop finder

Detected rock of round shape



Detected rock of large size

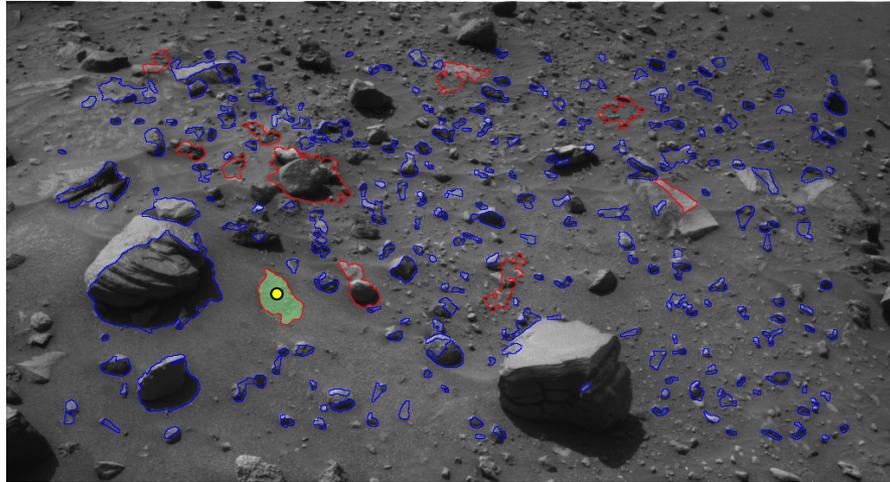


# Results: Target selection

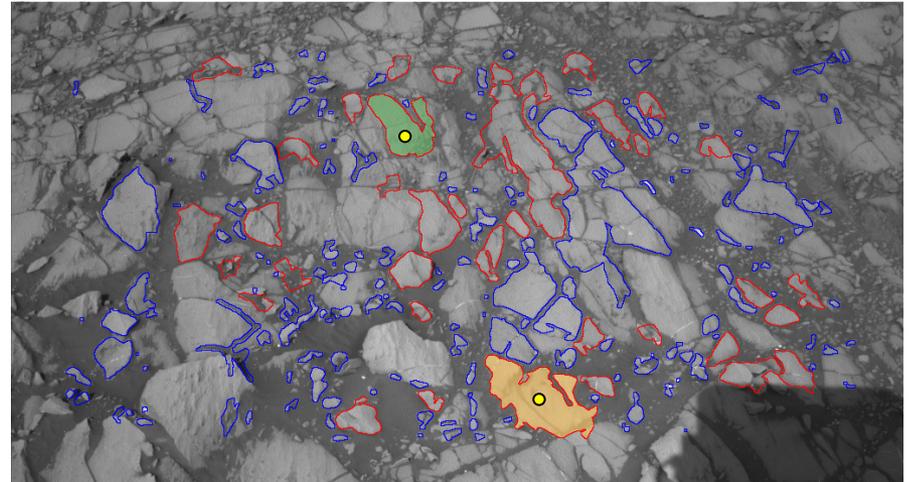
Examples from the NavCam runs on the following slides...

- Legend
  - Top target colored in **green**
  - 2<sup>nd</sup>-ranked target colored **orange** if observed
  - Targets retained after filtering: **red** outline
  - Targets found but filtered out: **blue** outline
    - Poor stereo range estimate, sun-safety, collision, outside ChemCam range, very small, very large
- **Keep in mind**
  - AEGIS' target-finding algorithm is searching for closed contours
  - **What matters most is:**
    - Which target was picked?
    - Where did the LIBS shots end up? ●

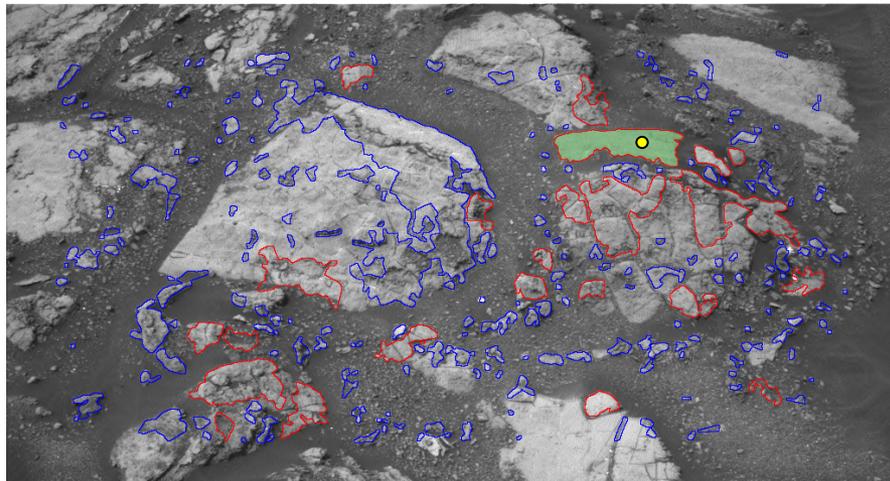
# Results: Target selection



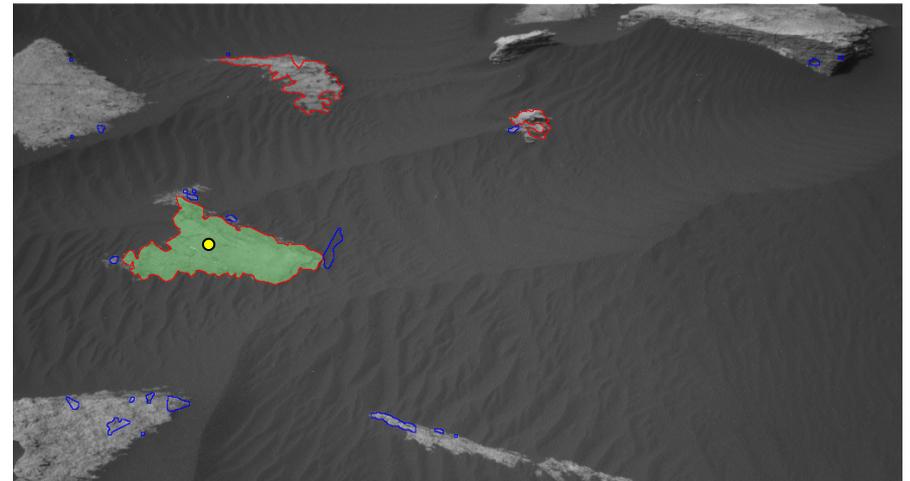
Sol 1400



Sol 1417



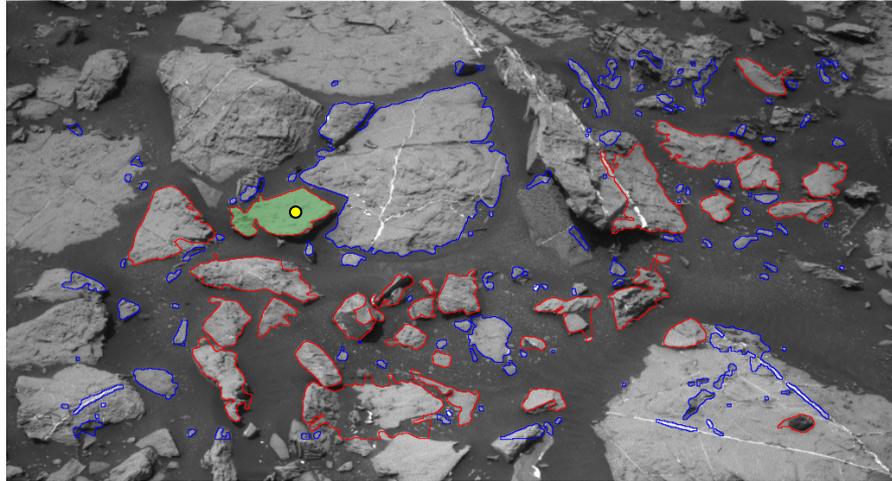
Sol 1481



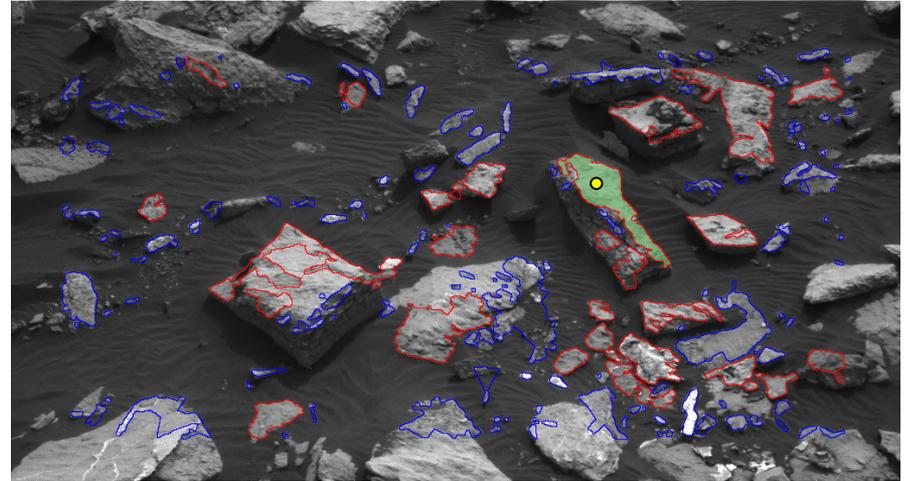
Sol 1636

("Sol" = Martian Day)

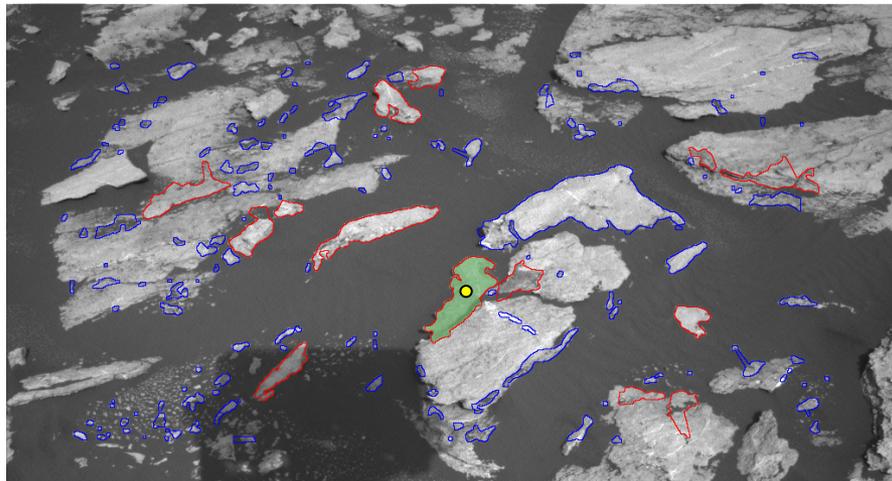
# Results: Target selection



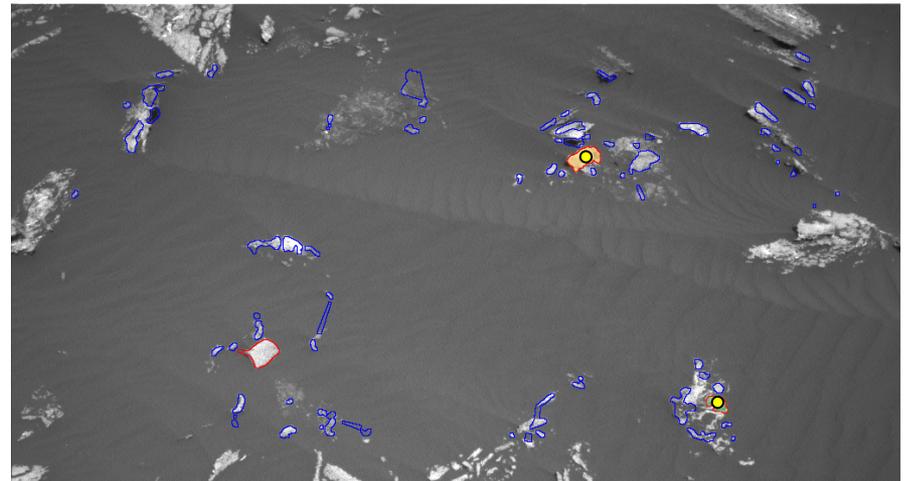
Sol 1449



Sol 1516



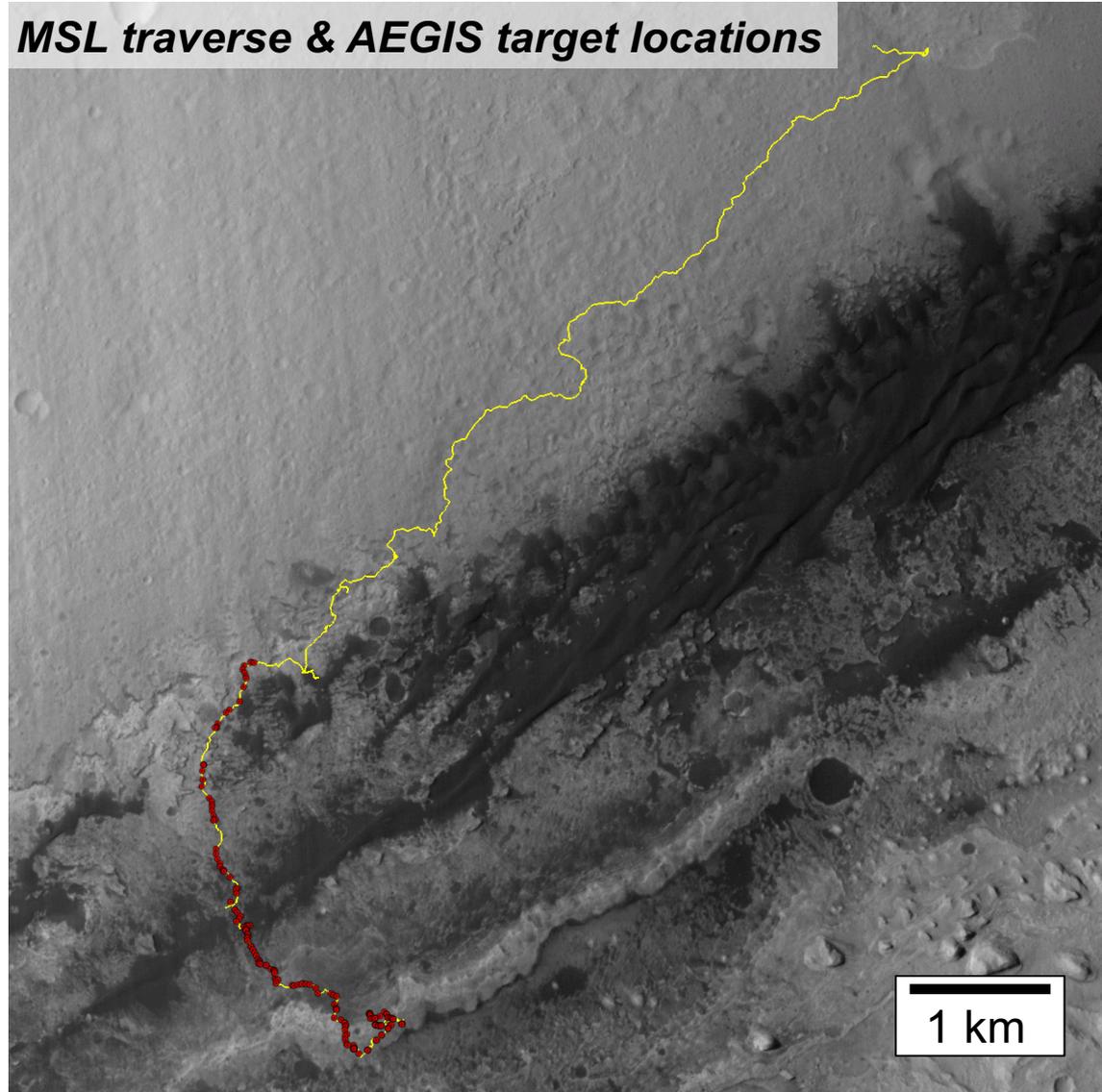
Sol 1605



Sol 1660

# Use by the Science Team

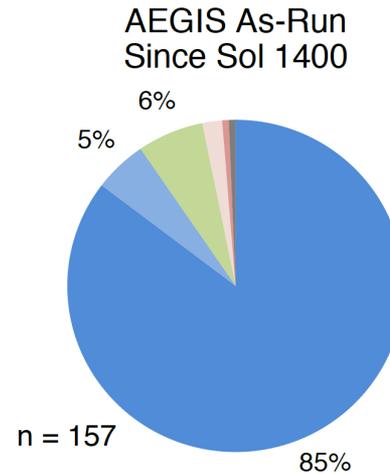
- First used [sol 1343](#)  
(planned on 13 May 2016)
- Results here as of [sol 2240](#)  
(planned 20 Nov 2018)
- Post-drive NavCam version:  
[150](#) runs, [177](#) targets
- Pre-drive RMI version:  
[3](#) runs
- Total MSL odometry since rollout: 6.859 km



# Results: Target selection

For the post-drive targets...

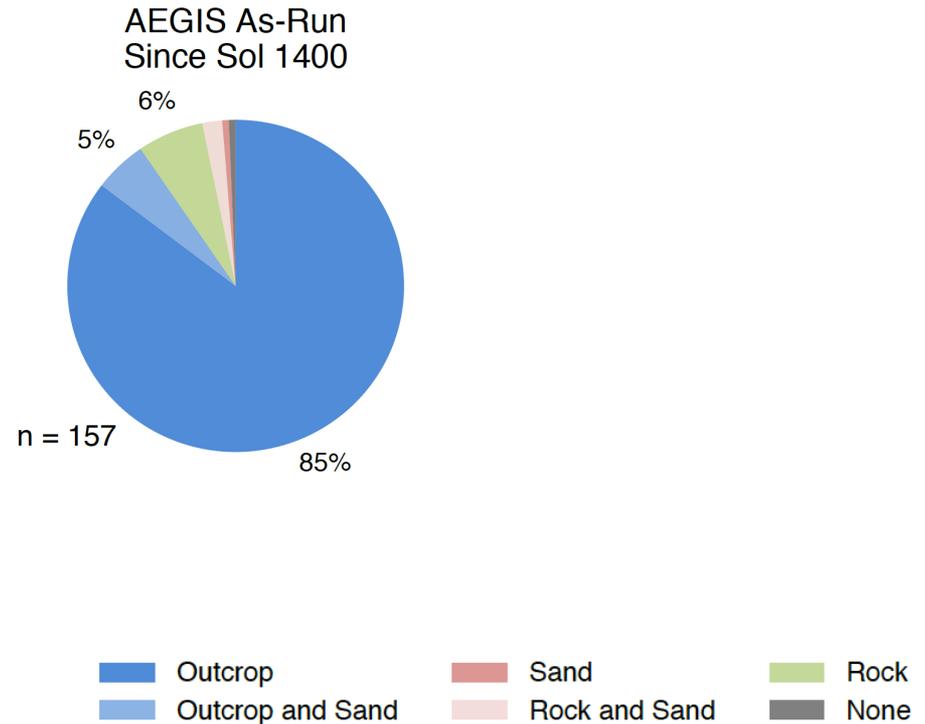
- ChemCam on AEGIS' top-ranked target (or top 2 if time allows)
- Hits clean **outcrop 85% of runs** since sol 1400 parameter update



# Results: Target selection

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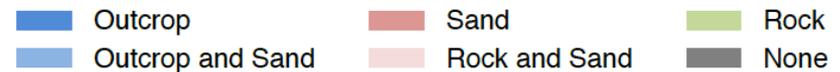
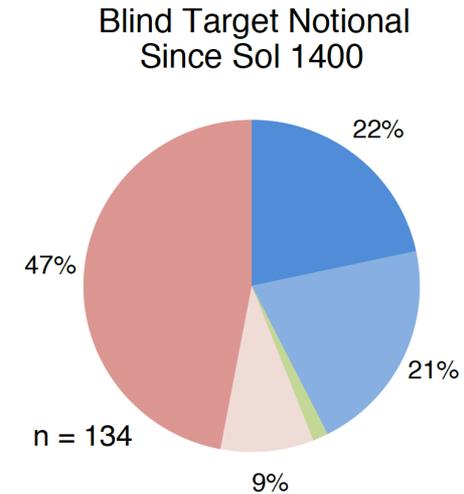
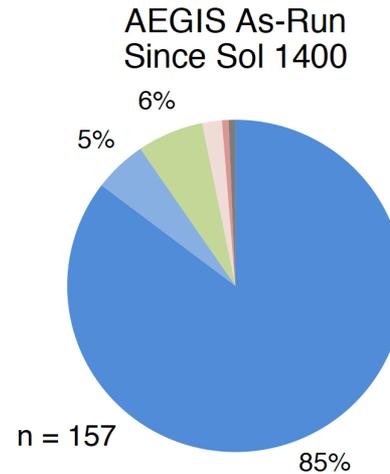
- ChemCam on AEGIS' top-ranked target (or top 2 if time allows)
- Hits clean **outcrop 85% of runs** since sol 1400 parameter update
- Exceptions:
  - Chose desired outcrop unit, but **some shots hit sand** on top or beside the outcrop
  - Chose a **float rock** or other material (usually when there is little outcrop in view)



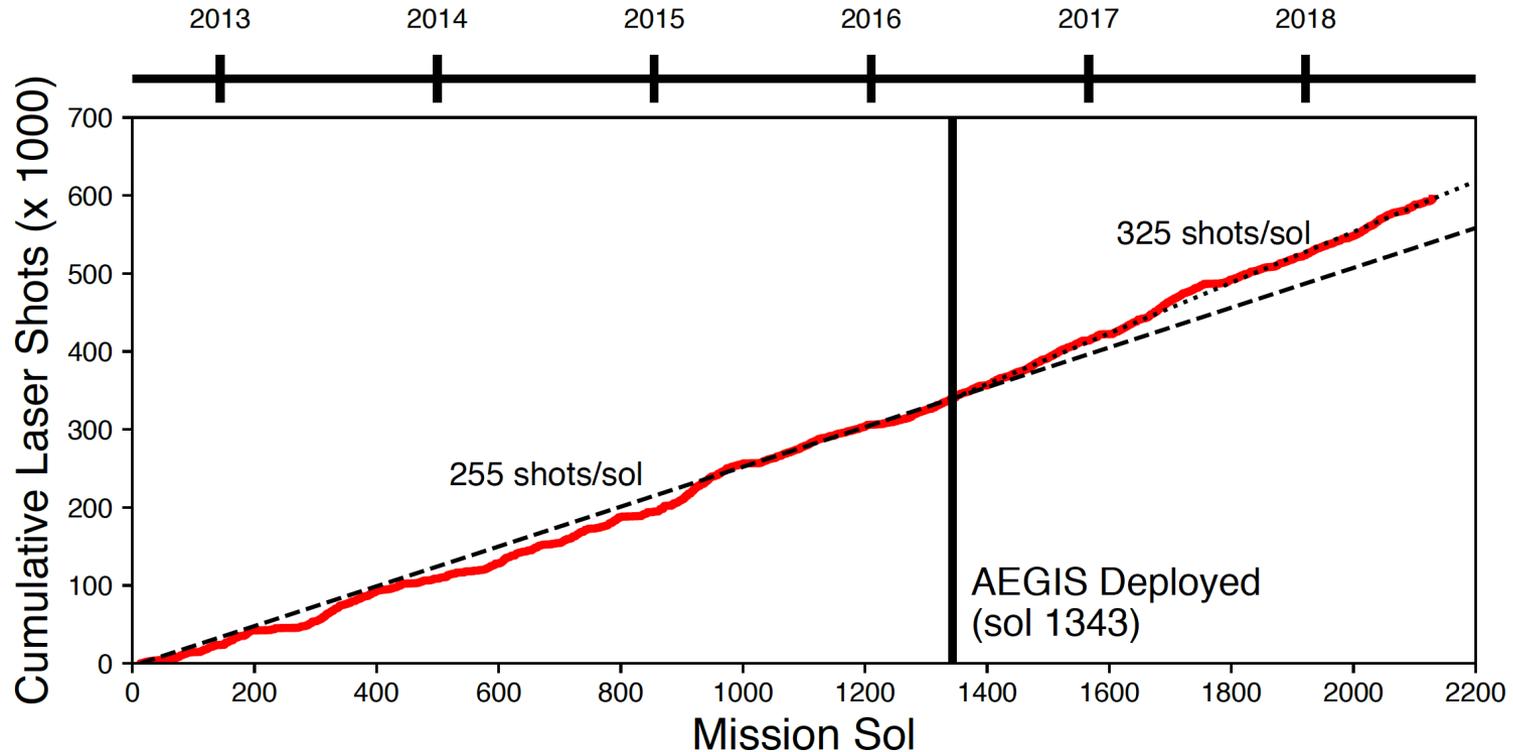
# Results: Target selection

For the post-drive targets...

- ChemCam on AEGIS' top-ranked target (or top 2 if time allows)
- Hits clean **outcrop 85% of runs** since sol 1400 parameter update
- Exceptions:
  - Chose desired outcrop unit, but **some shots hit sand** on top or beside the outcrop
  - Chose a **float rock** or other material (usually when there is little outcrop in view)
- Modeled **Blind Targeting** results for same sols:
  - 10x1 RLR @ standard pointing
  - Only one target



# More data from ChemCam



- Significant increase in rate of data return from ChemCam
- AEGIS rollout to science team on sol 1343

# Notable events

## Sol 1612: Highest chlorine

Highest concentration of chlorine ever measured by ChemCam on Mars

(So high it strains the calibration)

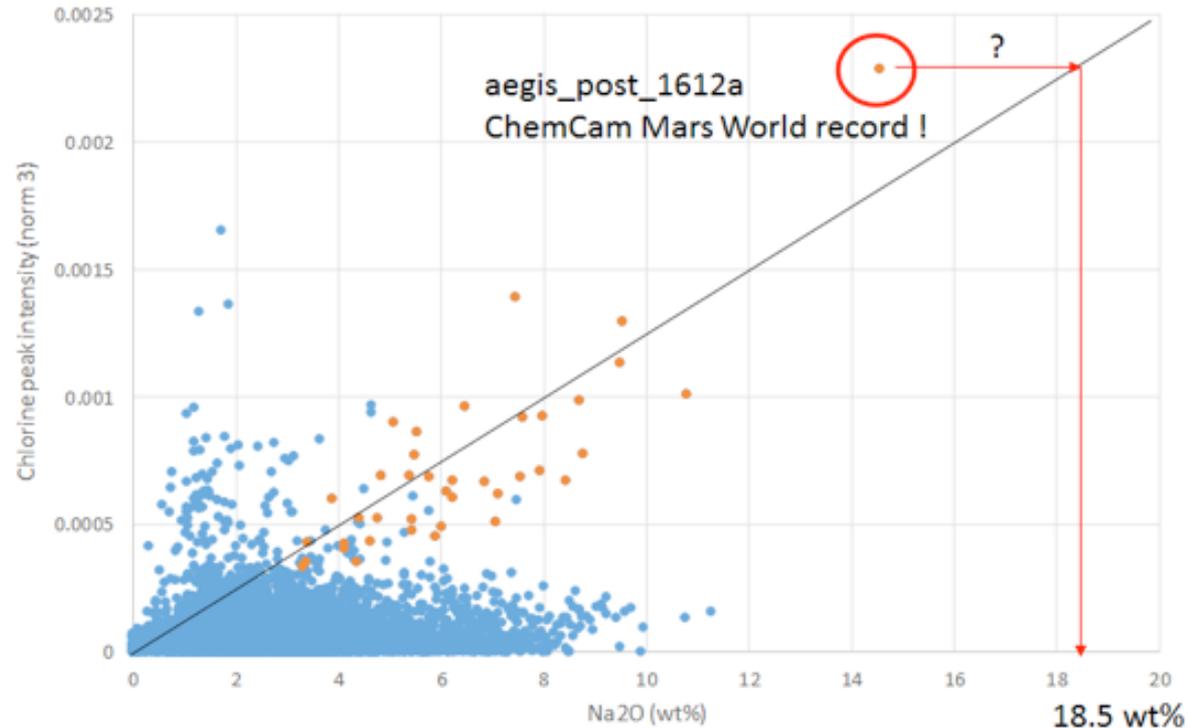


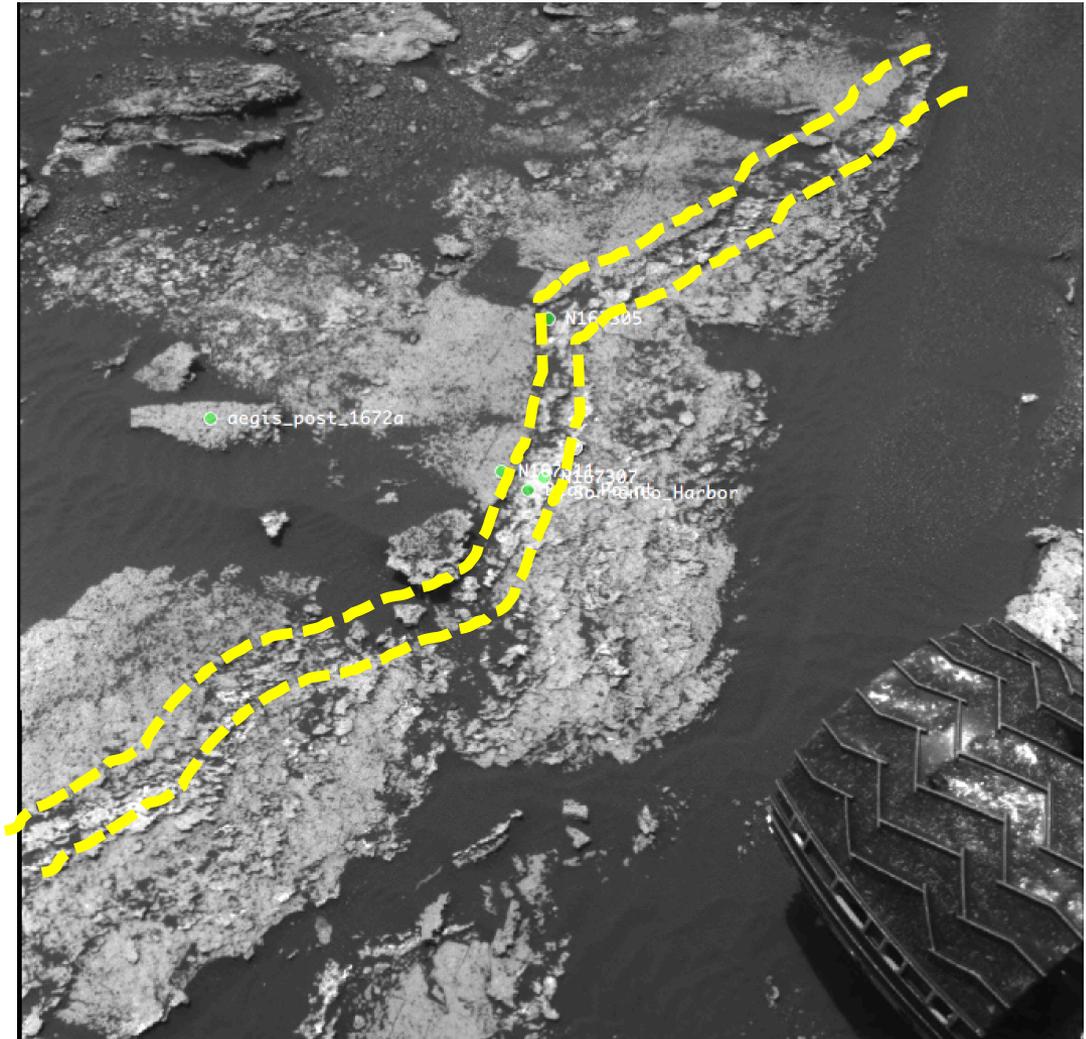
Figure from Pierre-Yves Meslin

# Notable events

## Sol 1673: Collect all 3

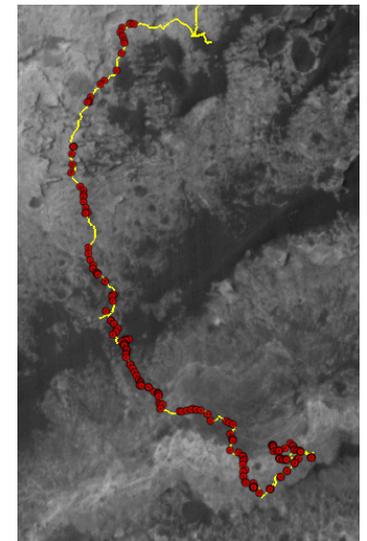
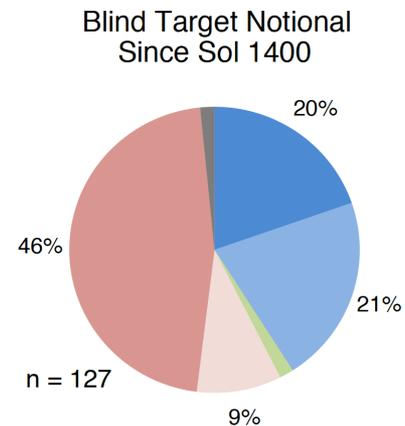
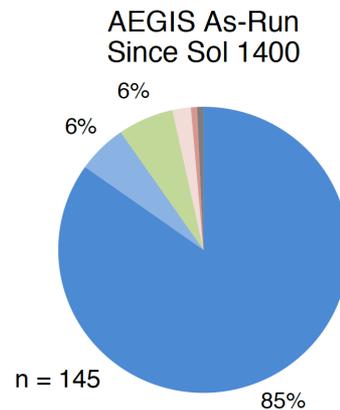
- 1) Upper, smooth material
- 2) Brighter vein
- 3) Lower, rough material

AEGIS had already measured the upper unit, allowing a complete survey with only 2 targeted measurements



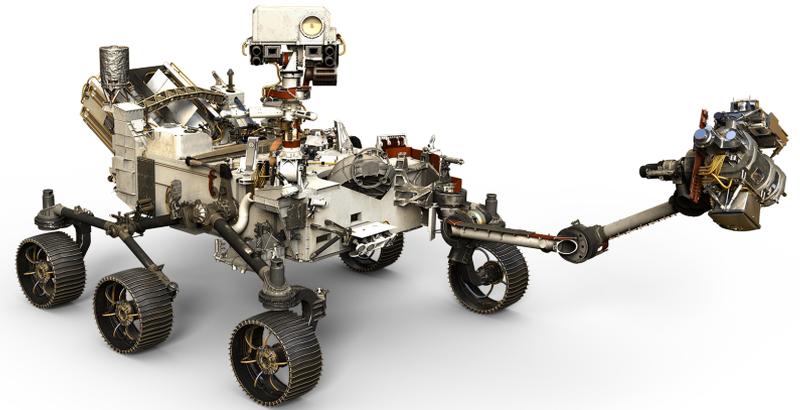
# Outcomes

- AEGIS team is very pleased with system performance to date
  - Feedback from **science team** has been very positive
  - 177 'bonus observations'
  - AEGIS-guided observations **often inform next sol's** tactical decisions
  - The team is learning **new ways to explore**



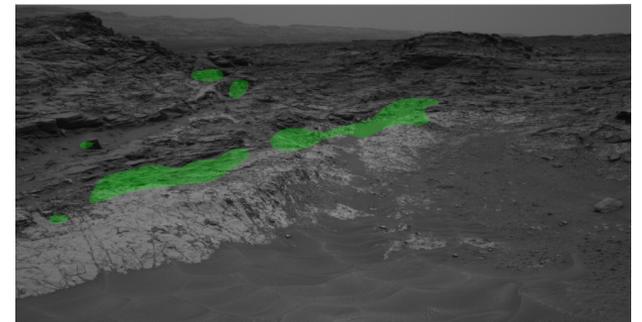
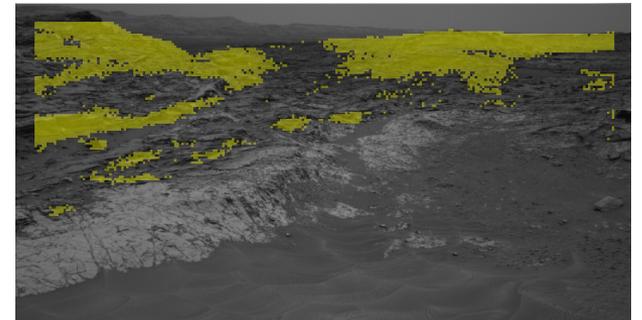
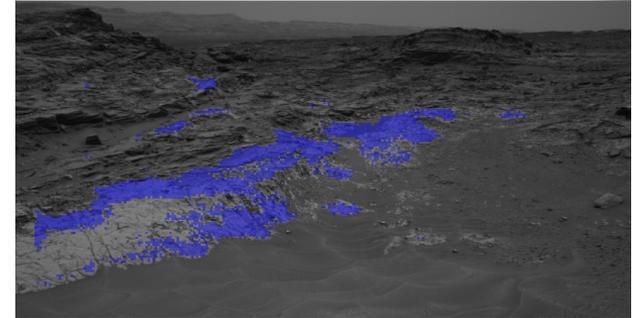
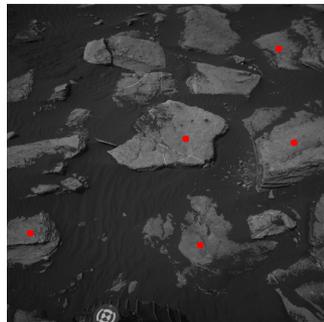
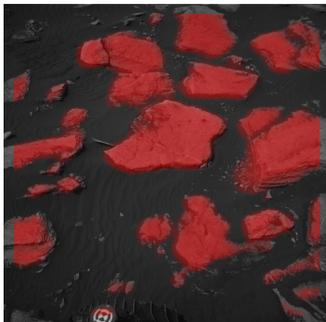
# The Future of AEGIS

- AEGIS is baselined for Mars 2020
  - SuperCam, the successor to ChemCam
  - Other mast-mounted instruments
- In this case, the winning features were:
  - **Demonstrated science value** to Mars Science Laboratory
    - Science Office and Instrument team support
  - **Projected ops efficiency savings** for ambitious surface mission
    - Mission System support
  - **Low development cost** to adapt MSL AEGIS flight code to M2020
    - Budget acceptability

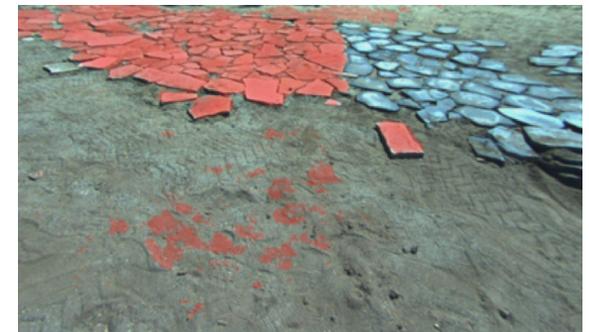
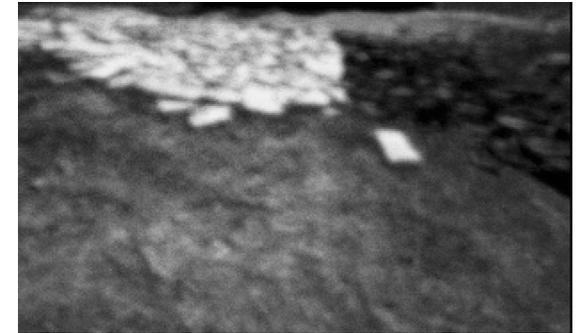
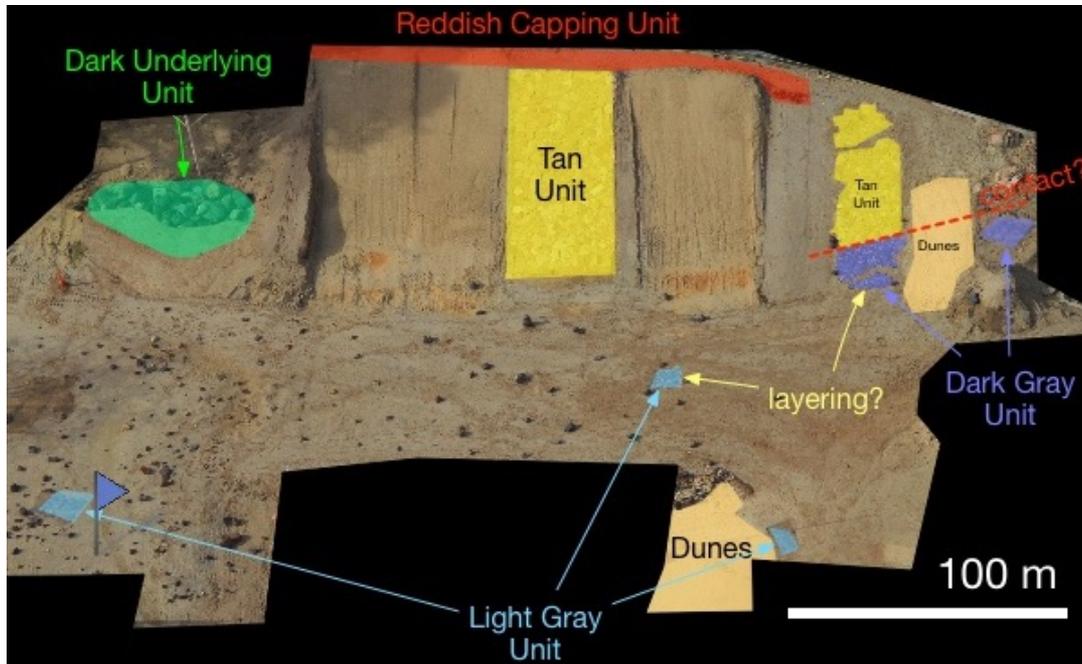


# Looking Beyond 2020

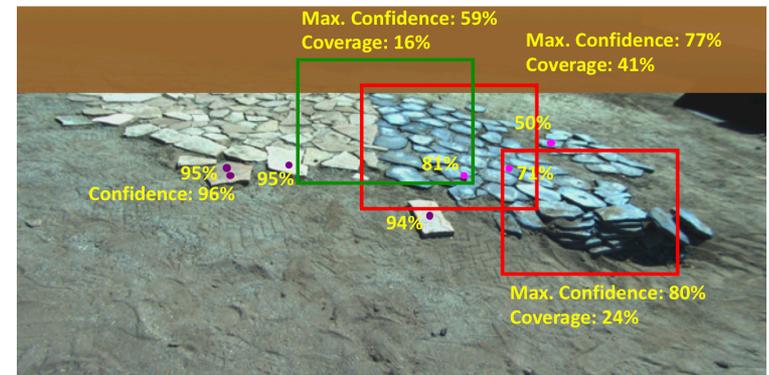
- Exploring new technologies for target detection to enable detection of new types of science targets.
- TextureCam software (Thomson et al.) uses a random forest for pixel-wise classification to directly detect rock units of interest.
- Classifier output enables finding contacts between two rock units.



# Autonomous Targeting Demo Campaign



- Simulate a region of interest
- Provide science team with tools to detect geologic features
- Simulate a “walkabout” campaign with autonomous targeting

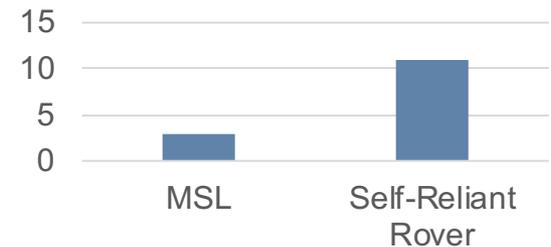


Tan Outcrop Dark Gray Outcrop Layering Dark Gray-Tan Contact

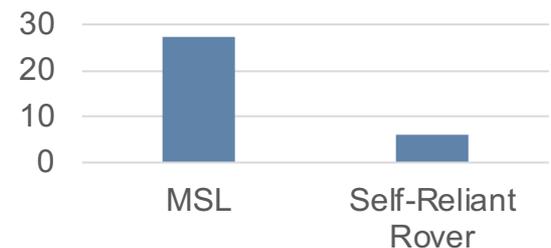
# Campaign Results

- The “Self-Reliant Rover” campaign incorporated autonomous science targeting, advanced autonomous navigation, and on-board planning.
- The new capabilities allowed scientists to plan several sols of activities at once across multiple locations between communication passes.
- Scientists judged that the autonomously acquired measurements sufficiently characterized each region.

Locations Surveyed  
in One Week  
(267% Increase)

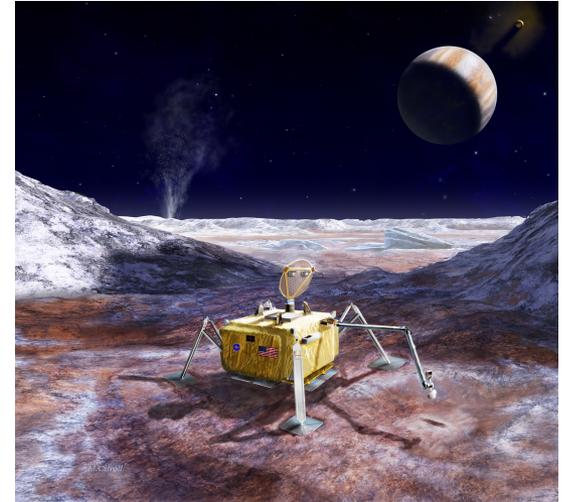


Sols to Complete  
Campaign  
(80% Reduction)



# Potential Future Destinations

- Europa Lander
- Venus (short-duration missions require autonomy)
- Small robotic platforms, such as the “PUFFER” (Pop-Up Flat Folding Explorer Robot)



Credit: Ted Stryk





**Jet Propulsion Laboratory**  
California Institute of Technology

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[jpl.nasa.gov](http://jpl.nasa.gov)