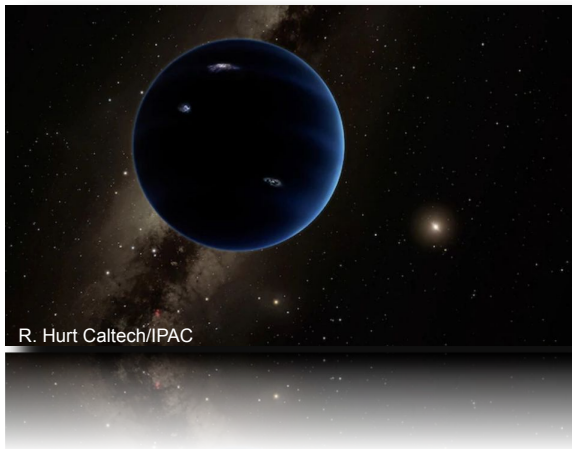


HSC search for Planet Nine: DIA pipeline performance with synthetic injections



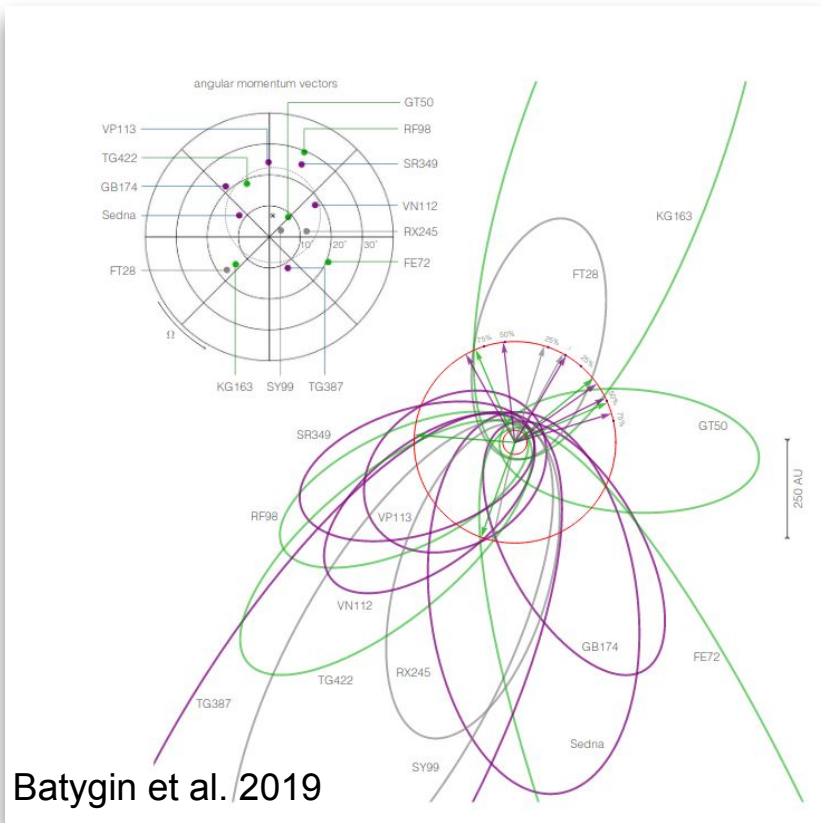
Surhud More (IUCAA)



**Mike Brown, Konstantin Batygin (Caltech), Fumi Yoshida (UOEH/CIT),
Masahiro Takada, Naoki Yasuda (IPMU), Robert Lupton (Princeton),
Shefali Negi (FZU)**

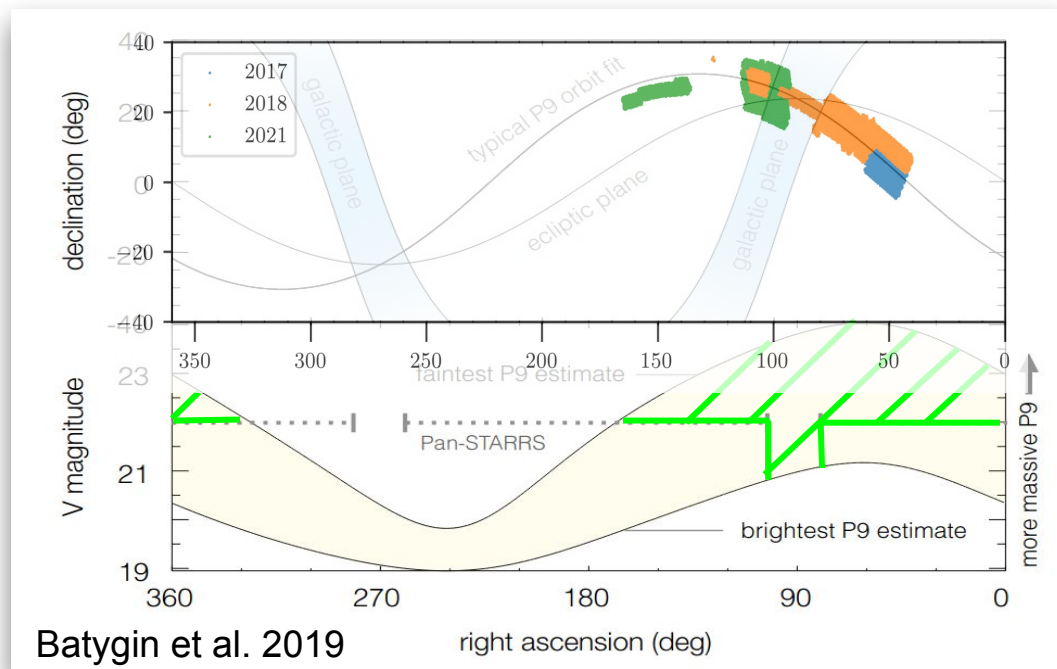
Rubin PCW: Aug 9, 2022

Peculiar orbits in the Kuiper belt



- Sedna (Brown et al. 2004) and VP113 (Trujillo and Sheppard 2014) have odd elongated orbits, detached from Neptune. Many more objects discovered since then.
- Objects with semi-major axes beyond 250 AU display physical clustering of orbital parameters.
- Batygin and Brown 2016 propose the existence of Planet Nine to explain this clustering.

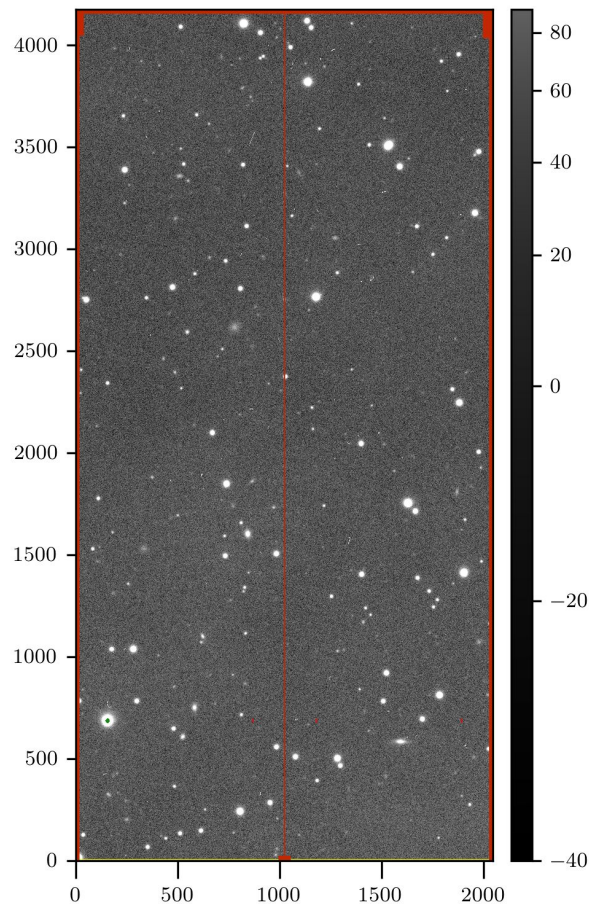
Subaru survey for Planet Nine



Please ask me for notes if you want to setup gen3 from scratch on a MPI based cluster!

- HSC data reduction performed with the Rubin LSST science pipelines (w_2022_14) at:
 - IUCAA (condor/condor on top of mpi)
 - Kavli IPMU (mpi)
 - FZU (condor)
- A total of 3959 exposures (400k CCD images) from 12.5 usable nights
- 8 TB of raw data

Calibrated image

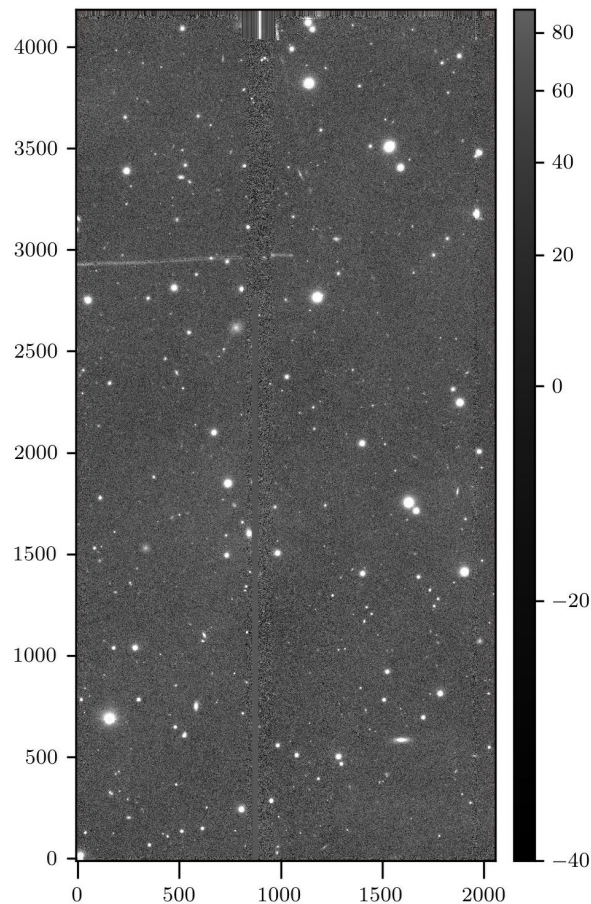


- Search for moving objects in HSC images of the same field on different nights
- Create template image by coadding images on the rest of the nights
- Subtract the calibrated image from the template.
- Search for diaSrcObjects that move

Calibrated image

—

Template from other nights



- Search for moving objects in HSC images of the same field on different nights
- Create template image by coadding images on the rest of the nights
- Subtract the calibrated image from the template.
- Search for diaSrcObjects that move

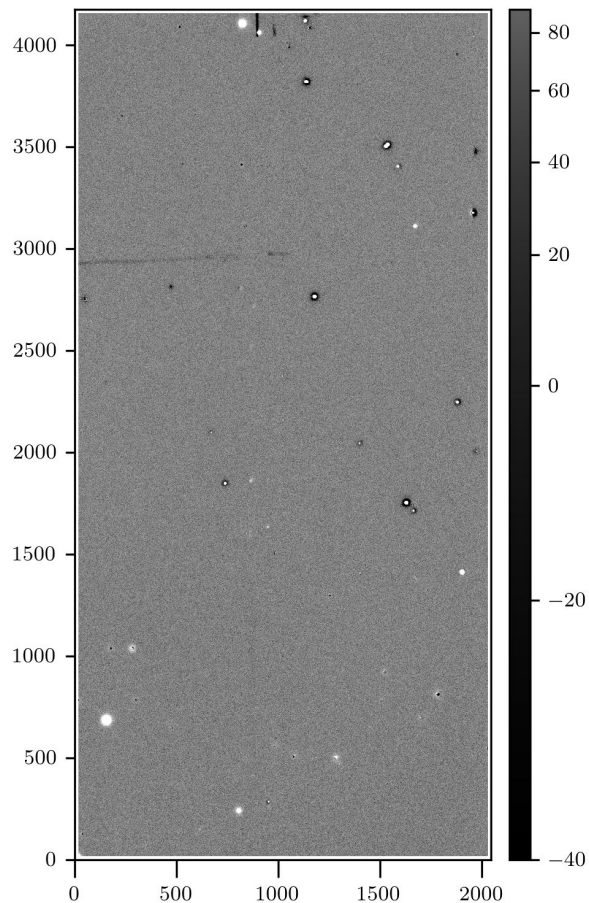
Calibrated image

—

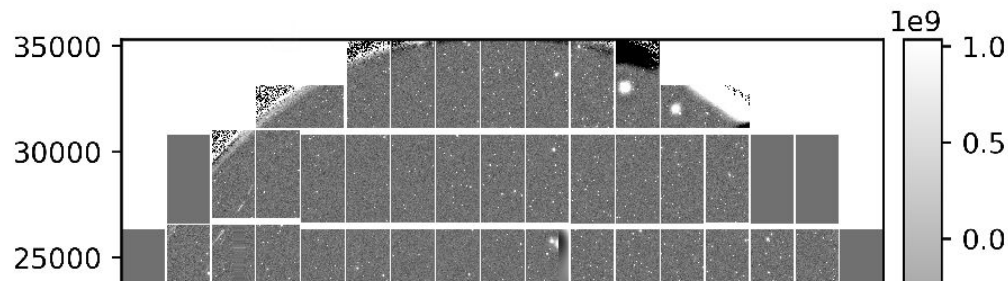
Template from other nights

=

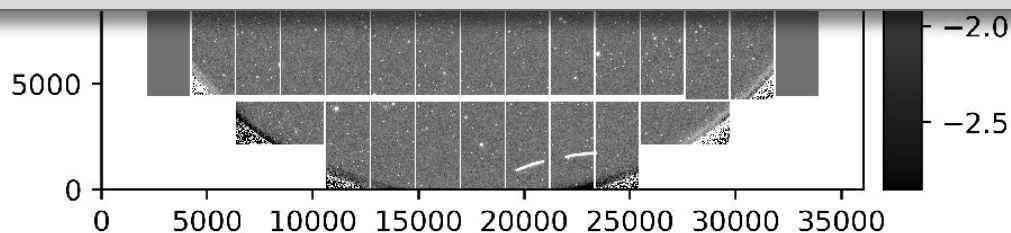
Difference image



- Search for moving objects in HSC images of the same field on different nights
- Create template image by coadding images on the rest of the nights
- Subtract the calibrated image from the template.
- Search for diaSrcObjects that move

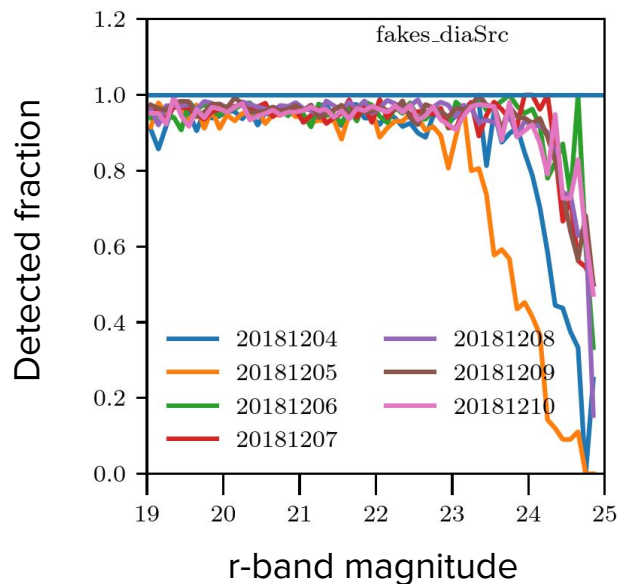


- Only star-like injections are now supported by the processCcdWithFakes task (see insertFakes.insertOnlyStars config option).
- Can insert objects on specific visits with certain magnitudes (see doMatchVisit config option)



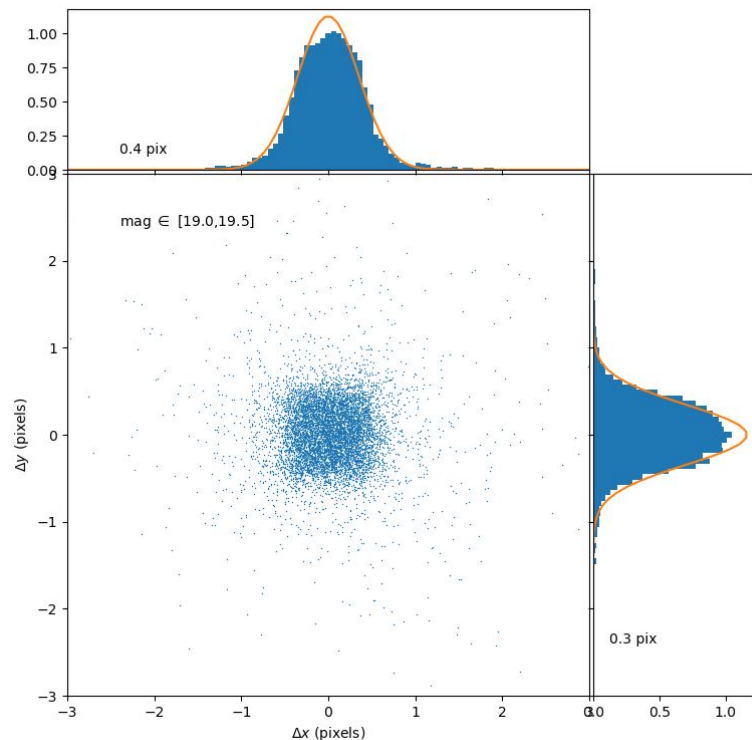
- On average about 65 diaSrcObjects per CCD chip.
- Pixel flags can be used to reduce these further by a factor of about 2.
- Characterize the performance of search by injecting synthetic Planet Nines

Planet Nine injections to characterize pipeline



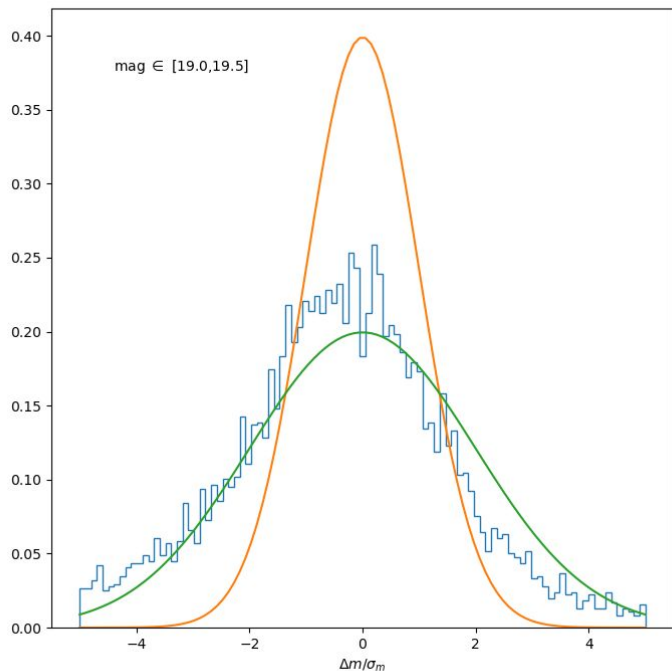
- About 95 percent of injected Planet Nines detected down to the magnitude limit on each night.
- Blending with nearby artefacts causes a loss of about 5%. Adding a deblending step recovers almost all injections (with minimal changes to the normal deblender config).
- A clear dependence of magnitude limit on the average seeing size was seen.

Astrometry



- Astrometry on the difference images better to about 0.4 pixels at the bright end (about 19.0-19.5), while about 1 pixel at the faint end (24.0-24.5)
- Fairly symmetrical distribution in each directions but square-ish residuals in the x-y plane.

Photometry



- Photometry errors are underestimated at the bright end by a factor of about 2.
- Likely because the Poisson error from the synthetic injections is not added to the variance plane
- The errors look better at the fainter end, as the image variance dominates over the Poisson term of the injection.

Backup slides:



Planet Nine detection pipeline

Catalog of difference imaging sources

```
ra,dec,visit,detector,magnitude,magnitude_err,magnitude_ap,magnitude_ap_err,psFlux,psFluxErr,totFlux
,totFluxErr,elongation,sizeRatio,pixelFlags_saturatedCenter,jd,mjd,shape_flag_shift,isDipole,pixelFl
ags_interpolatedCenter,pixelFlags_suspectCenter,pixelFlags_edge,fake,mikeId,centroid_neg_flag,xx,yy,
diaSourceId,parentDiaSourceId,pixelFlags_fakeCenter,pixelFlags_fake
94.92699706834765,31.573913043376255,249016,0,23.165648972558685,0.05644782839764048,23.411441938422
364,0.20972099790874732,1966.7103847383971,102.25000310301138,2107.906329941938,84.36214137199782,1.
0552225947313523,,False,2459252.7301428937,59252.23014289352,False,False,False,False,False,-99
,False,1648.0084228515625,234.154541015625,106951557618074276,0,False,False
```

Planet Nine detection pipeline

Catalog of difference imaging sources

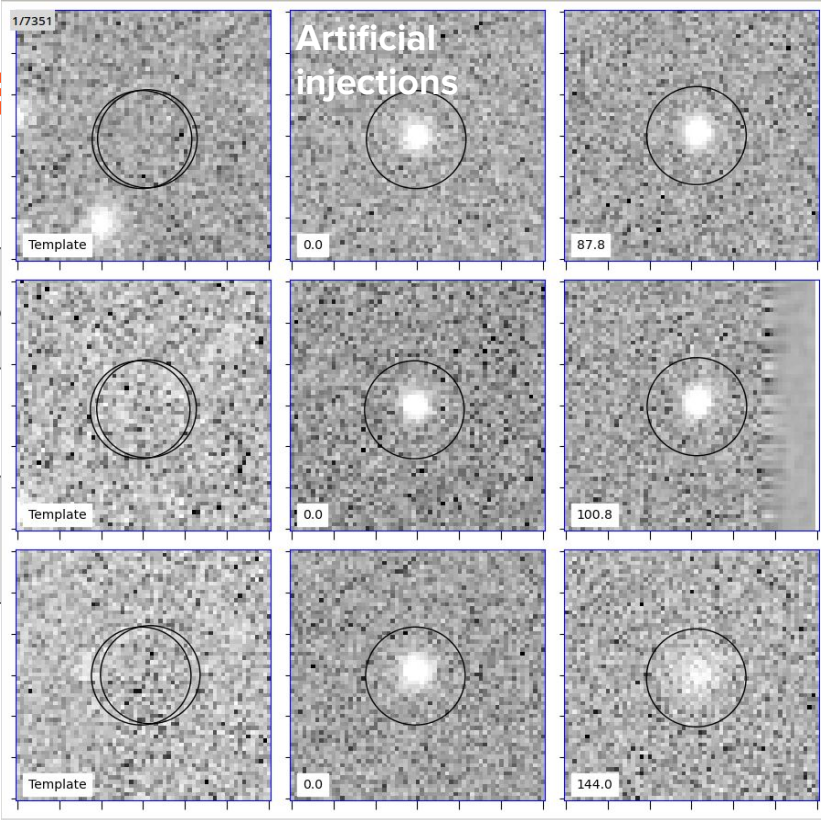
```
ra,dec,visit,detector,magnitude,magnitude_err,magnitude_ap,magnitude_ap_err,psFlux,psFluxErr,totFlux,totFluxErr,elongation,sizeRatio,pixelFlags_saturatedCenter,jd,mjd,shape_flag_shift,isDipole,pixelFlags_interpolatedCenter,pixelFlags_suspectCenter,pixelFlags_edge,fake,mikeId,centroid_neg_flag,xx,yy,diaSourceId,parentDiaSourceId,pixelFlags_fakeCenter,pixelFlags_fake
94.92699706834765,31.573913043376255,249016,0,23.165648972558685,0.05644782839764048,23.411441938422364,0.20972099790874732,1966.7103847383971,102.25000310301138,2107.906329941938,84.36214137199782,1.0552225947313523,,False,2459252.7301428937,59252.23014289352,False,False,False,False,False,-99,
,False,1648.0084228515625,234.154541015625,106951557618074276,0,False,False
```



Link potential candidates for Planet nine like orbits

Planet Nine

Catalog of difference im

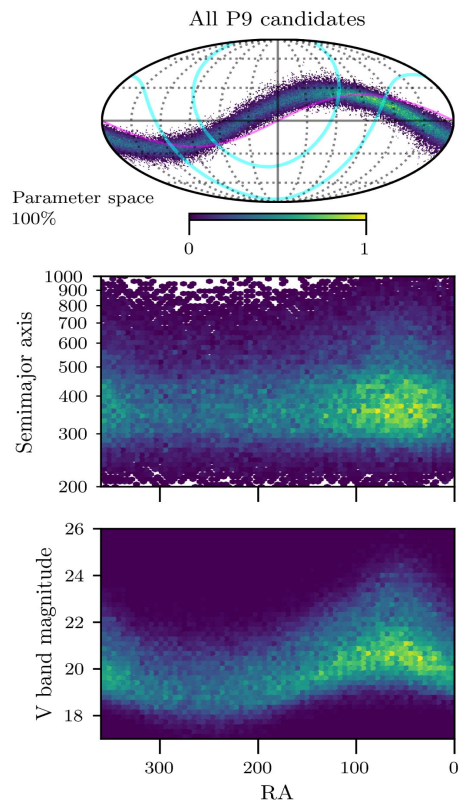


```
p,magnitude_ap_err,psFlux,psFluxErr,totFlux  
er,jd,mjd,shape_flag_shift,isDipole,pixelFl  
s_edge,fake,mikeId,centroid_neg_flag,xx,yy,  
Flags_fake  
2558685,0.05644782839764048,23.411441938422  
1138,2107.906329941938,84.36214137199782,1.  
352,False,False,False,False,False,False,-99  
4276,0,False,False
```

Planet nine like orbits

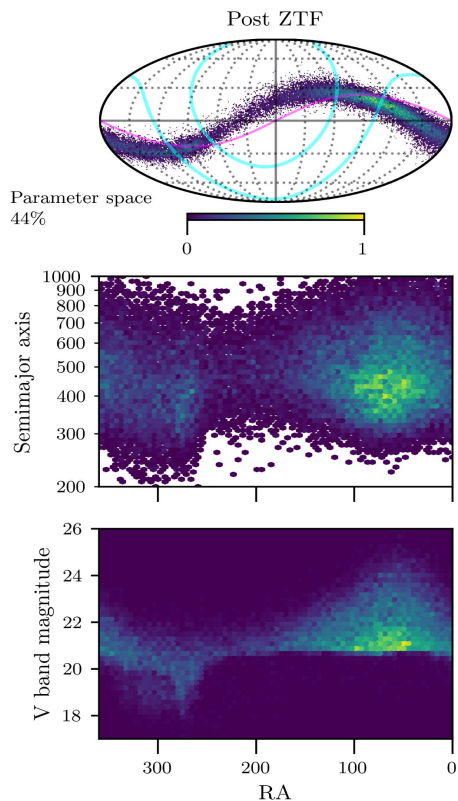
Finalize with visual inspection

Constraints on the parameter space



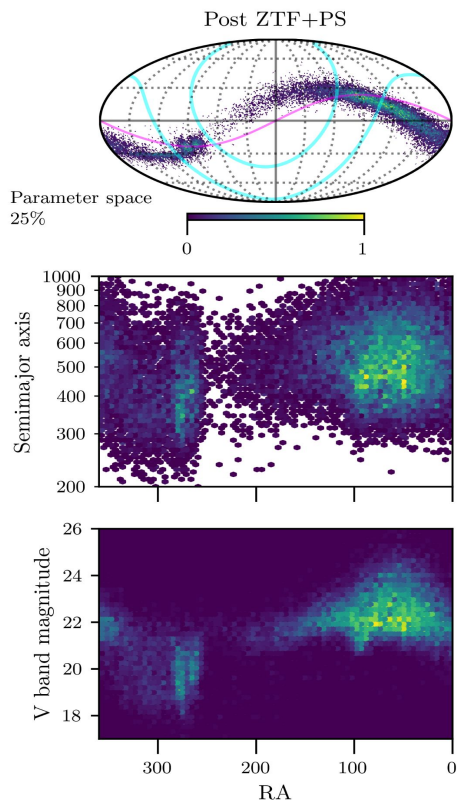
- Planet Nine search carried out using data from ZTF, Pan-starrs, Dark energy survey, and Subaru HSC
- The joint constraints together rule out about 84 percent of the parameter space.
- A lot of the remaining area is in the galactic plane
- We have been allocated 3 nights in January on Subaru to wrap up the galactic plane on the northern side.

Constraints on the parameter space



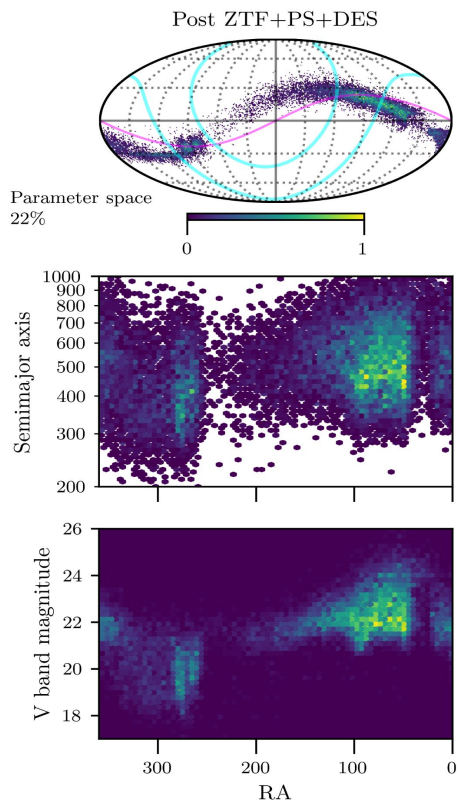
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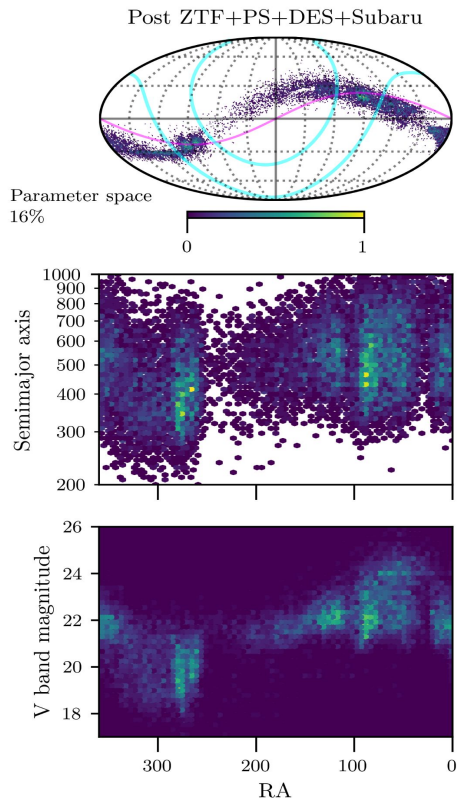
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Backup slides

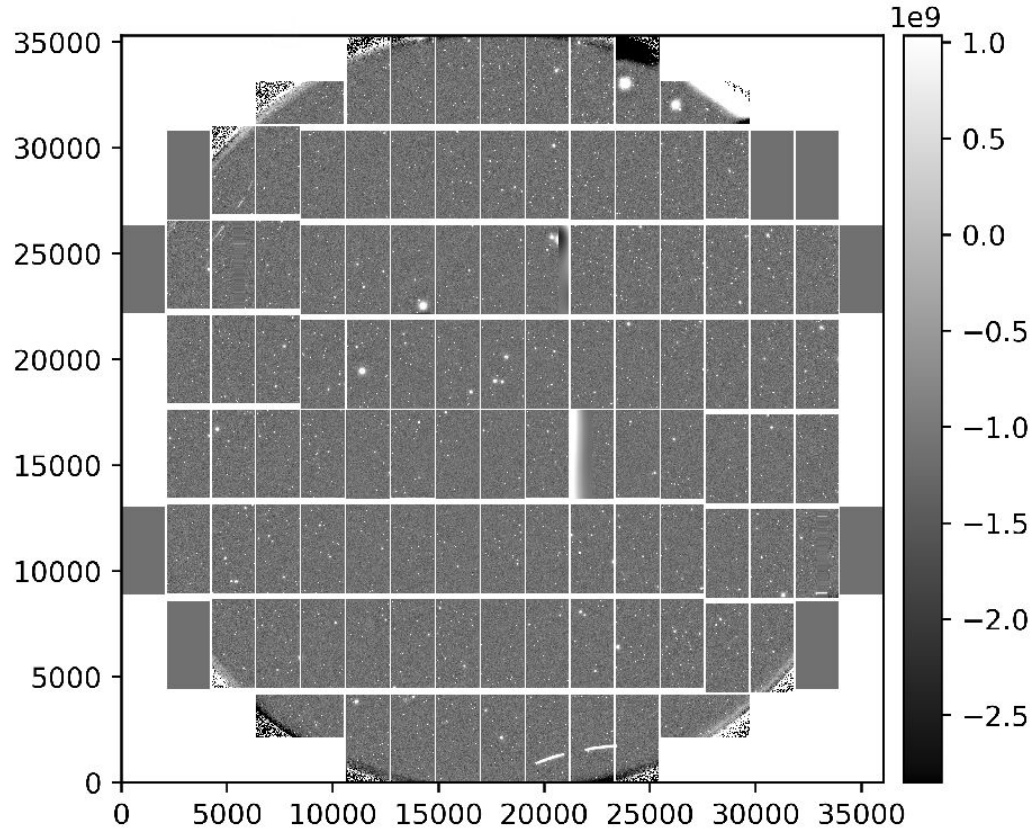
Calibrated image

—

Template from other

=

Difference image

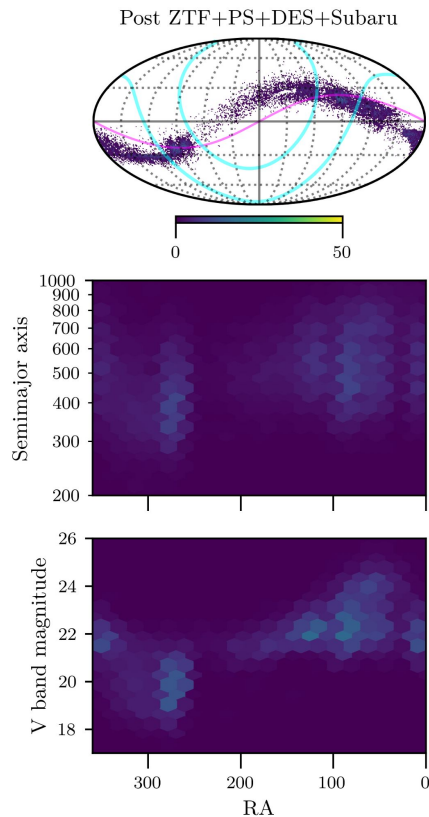


g for a planet is
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with the template

fferencing helps
d of the static

Constraints on the parameter space



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Thank you!





Stellarium

Quadrantids

December Leonis Minorids

Alkaid

Alioth

Kochab

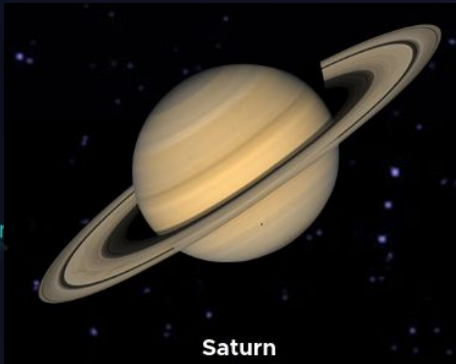
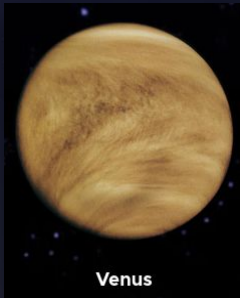
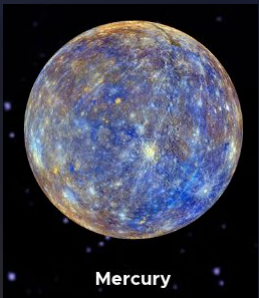
Dubhe

Polaris

NW

N

Patterns of stars in the sky (constellations)



Rigel Kentaurus

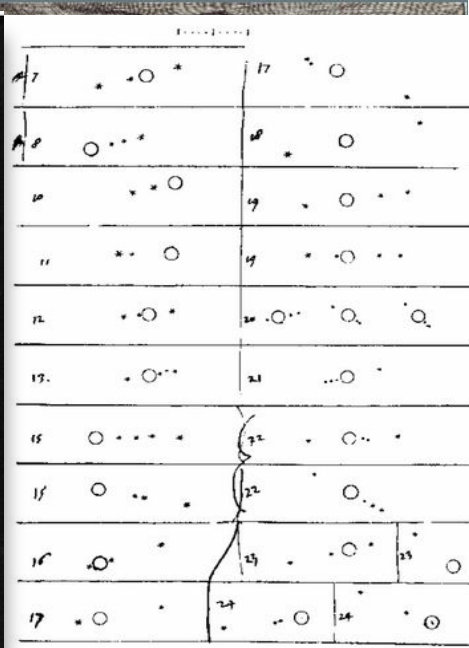
SW

SE

Planetes asteres: Wandering stars (planets)

The invention of the telescope

Bella, Stefano della

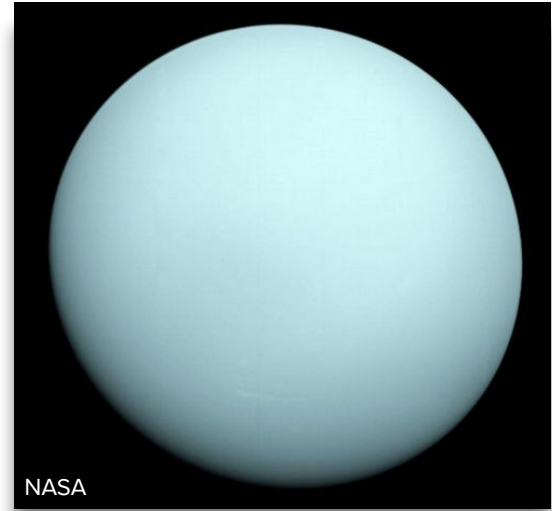
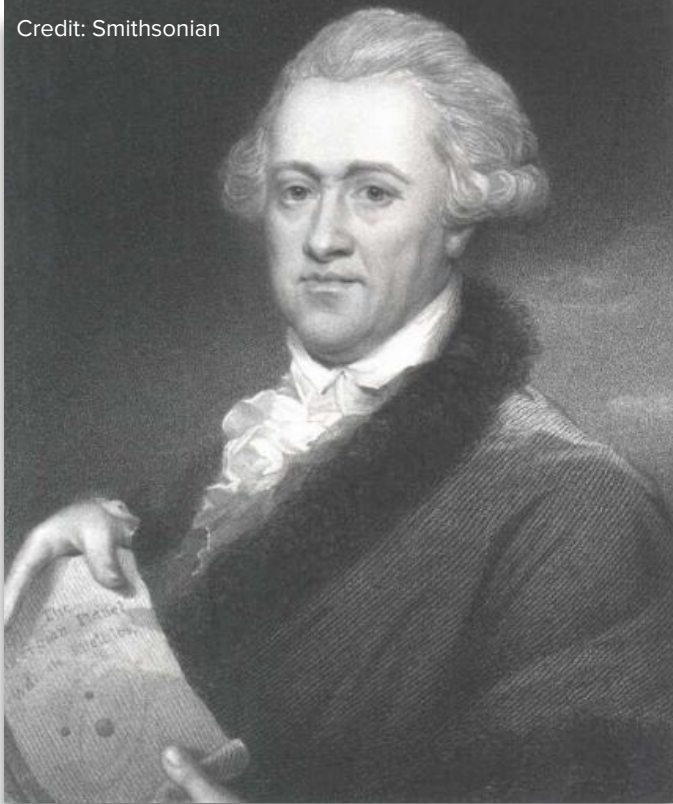


- Lippershey, a Dutch engineer filed the first patent for the telescope in 1608
- It was first invented for terrestrial use, but proved far more consequential to our understanding of the cosmos.
- Galileo discovered the moons of Jupiter and shattered the foundations of geocentric theories of the Universe.

Technological advances drive discoveries!

Discovery of Uranus

Credit: Smithsonian



- Serendipitously found by William Herschel through a telescope on March 13, 1781
- First believed to be a comet but quickly realized that it was a new planet because of its circular orbit!

ment aux observations modernes, mais qui ne pourront satisfaire convenablement aux observations anciennes. Il fallait se décider entre ces deux partis; j'ai dû m'en tenir au second, comme étant celui qui réunit le plus de probabilités en faveur de la vérité, et je laisse aux tems à venir le soin de faire connaître si la difficulté de concilier les deux systèmes tient réellement à l'inexactitude des observations anciennes, ou si elle dépend de quelque action étrangère et inaperçue, qui aurait agi sur la planète.

Maintenant, en conservant la notation adoptée pour les Tables de Jupiter et de Saturne, on aura de même la formule suivante pour type des équations de condition :

$$(1 + 2e \cos \phi) x + t(1 + 2e \cos \phi) y + z \sin \phi - u \cos \phi = dV''.$$

En désignant par V'' la longitude héliocentrique d'Uranus, pour la même époque que pour Jupiter et Saturne, j'ai trouvé la formule suivante :

$$V'' = \phi'' + 154''.63.t.$$

$$\begin{aligned} \text{I.} & \left\{ \begin{aligned} & + (59.427'',54 - t.0'',3216) \sin(\phi'' - \omega'') \\ & + (17.33,14 - t.0'',0188) \sin 2(\phi'' - \omega'') \\ & + (70,08 - t.0'',0011) \sin 3(\phi'' - \omega'') \\ & + (3,25 - t.0'',0001) \sin 4(\phi'' - \omega'') \\ & + (0,16 - t.0'',0000) \sin 5(\phi'' - \omega''). \end{aligned} \right. \\ \text{II.} & \left\{ \begin{aligned} & + 68'',55 \sin(\phi' - \phi'' + 23'',56) - 12'',49. \sin 2(\phi' - \phi'') \\ & - 2'',55 \sin 3(\phi' - \phi'') - 0'',72 \sin 4(\phi' - \phi'') - 0'',24 \sin 5(\phi' - \phi''). \end{aligned} \right. \\ \text{III.} & \left\{ \begin{aligned} & - (436'',41 - t.0'',034) \sin(\phi' - 2\phi'' + 79'',28 + t.48'',7) \\ & - 5'',07 \sin(2\phi' - 4\phi'' + 42'',87). \end{aligned} \right. \\ \text{IV.} & + 160'',92 \sin(\phi - \phi'') - 0'',59 \sin 2(\phi - \phi''). \\ \text{V.} & - 10,60. \sin(\phi - 2\phi'' - 16'',50). \\ \text{VI.} & + 7,79. \sin(2\phi' - 3\phi'' + 25'',92). \\ \text{VII.} & + 4,07. \sin(\phi' + 5'',09). \\ \text{VIII.} & + 3,89. \sin(2\phi - \phi'' - 11'',49). \\ \text{IX.} & + 3,81. \sin(\phi + 14'',87). \\ \text{X.} & + 2,86. \sin(2\phi' - 5\phi'' + 75'',99). \\ \text{XI.} & + 2,55. \sin(2\phi' - \phi'' - 81'',89). \\ \text{XII.} & + 1,38. \sin(3\phi' - 4\phi'' + 26'',24). \end{aligned}$$

La réduction à l'écliptique est

$$- 29'',04 \sin(2V'' - 28'').$$

Le rayon vecteur r'' d'Uranus est donné par la formule

$$r'' = 19,212098 - t.0,00000023.$$

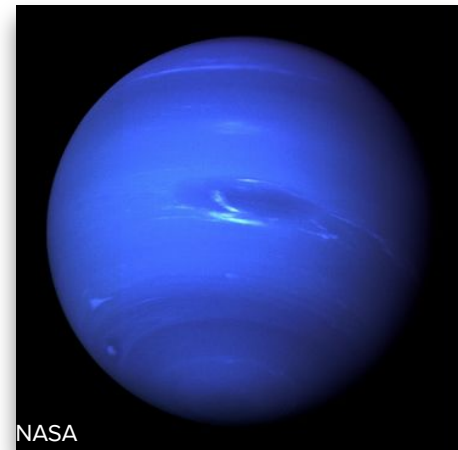
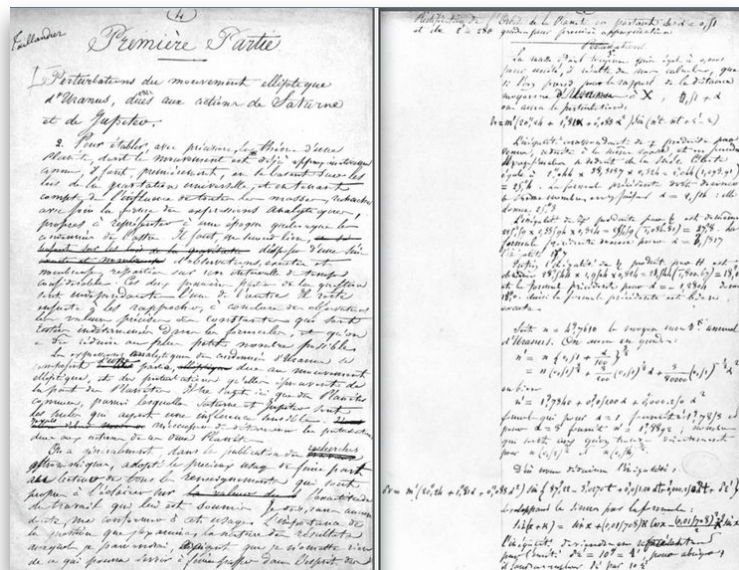
Années.	Erreurs.	Années.	Erreurs.	Années.	Erreurs.	Années.	Erreurs.	Années.	Erreurs.
1690	+ 88',7	1783	+ 16',7	1792	- 13',0	1803	- 44',5	1814	+ 41',3
1712	+ 82',6	1784	+ 13',4	1793	- 19',5	1804	- 37',8	1815	+ 41',2
1715	+ 4',5	1785	+ 8',7	1794	- 15',3	1805	- 32',2	1816	+ 47',6
1750	- 124',0	1786	+ 6',5	1794	- 18',5	1806	- 25',1	1816	+ 49',1
1750	- 101',4	1786	+ 12',5	1795	- 20',6	1806	- 8',5	1816	+ 27',7
1753	- 69',2	1786	+ 11',7	1795	- 25',8	1807	- 26',5	1817	+ 52',9
1756	- 75',7	1786	+ 10',5	1796	- 13',0	1807	- 0',9	1818	+ 56',7
1756	- 23',8	1787	+ 12',1	1796	- 35',0	1808	- 14',1	1819	+ 76',2
1769	+ 10',9	1788	+ 8',1	1797	- 18',9	1809	- 19',6		
1771	+ 50',2	1788	+ 8',9	1797	- 37',9	1810	- 5',9		
1781	+ 17',8	1789	+ 1',4	1798	- 37',6	1811	+ 9',3		
1781	+ 22',9	1789	+ 23',5	1799	- 55',4	1811	+ 1',0		
1782	+ 27',6	1790	+ 14',8	1799	- 45',4	1812	+ 0',1		
1782	+ 17',7	1790	+ 16',9	1800	- 25',8	1812	+ 22',0		
1782	+ 15',9	1791	- 12',6	1801	- 44',3	1813	+ 16',6		
1783	+ 24',9	1791	- 5',1	1802	- 49',7	1813	+ 49',4		
1783	+ 24',8	1792	- 7',6	1802	- 34',2	1814	+ 27',9		

Il est difficile d'admettre que les observations modernes comportent de telles erreurs. On ne peut, non plus, les rejeter sur la théorie, ni sur l'oubli de quelque terme important. Cette théorie est connue, et les soins que j'ai mis à mes calculs ne permettent pas qu'on s'arrête sur ce dernier point. Ce serait donc sur l'exactitude des observations anciennes que le doute retomberait. En effet, il est difficile de s'en défendre, quand on discute les circonstances dans lesquelles elles ont été faites : l'observation de Bradley est unique, le passage n'a été observé qu'au cinquième fil et la hauteur n'a été estimée qu'en degrés et minutes. La même remarque s'applique à l'observation de Mayer. Les observations de Flamsteed sont jugées depuis longtemps, et l'on sait que ses instrumens n'étaient ni bien exécutés, ni exactement placés dans le méridien. Quant à celles de Lemonnier, on peut voir dans la Connaissance des Tems pour 1821 ce qu'il est permis d'en penser.

D'après ces considérations, j'ai supprimé les dix-sept observations anciennes et formé de nouvelles Tables avec les seules observations modernes. On peut voir dans le tableau suivant des équations de condition, avec quelle approximation ces dernières sont représentées; une seule va à 32'',4 centésimales, ou 10'' sexagésimales, et toutes les autres sont généralement beaucoup plus petites. Mais les observations anciennes sont moins bien satisfaites, et l'une des erreurs s'élève jusqu'à 227'',7, ou 73'',8 sexagésimales.

Telle est donc l'alternative que présente la formation des Tables de la planète Uranus, que si l'on combine les observations anciennes avec les modernes, les premières seront passablement représentées, tandis que les secondes ne le seront pas avec la précision qu'elles comportent; et que si l'on rejette les unes pour ne conserver que les autres, il en résultera des Tables qui auront toute l'exactitude désirable relative-

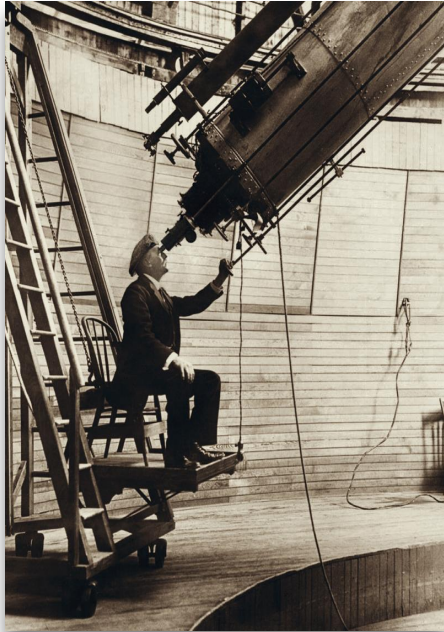
Discovery of Neptune



- The genius of Le Verrier was to use these anomalies to predict the position of a planet which could perturb Uranus from its orbit.
- Found by Johann Galle and Heinrich d'Arrest within hours of observation on Sep 24, 1846

Percival Lowell and search for Planet X

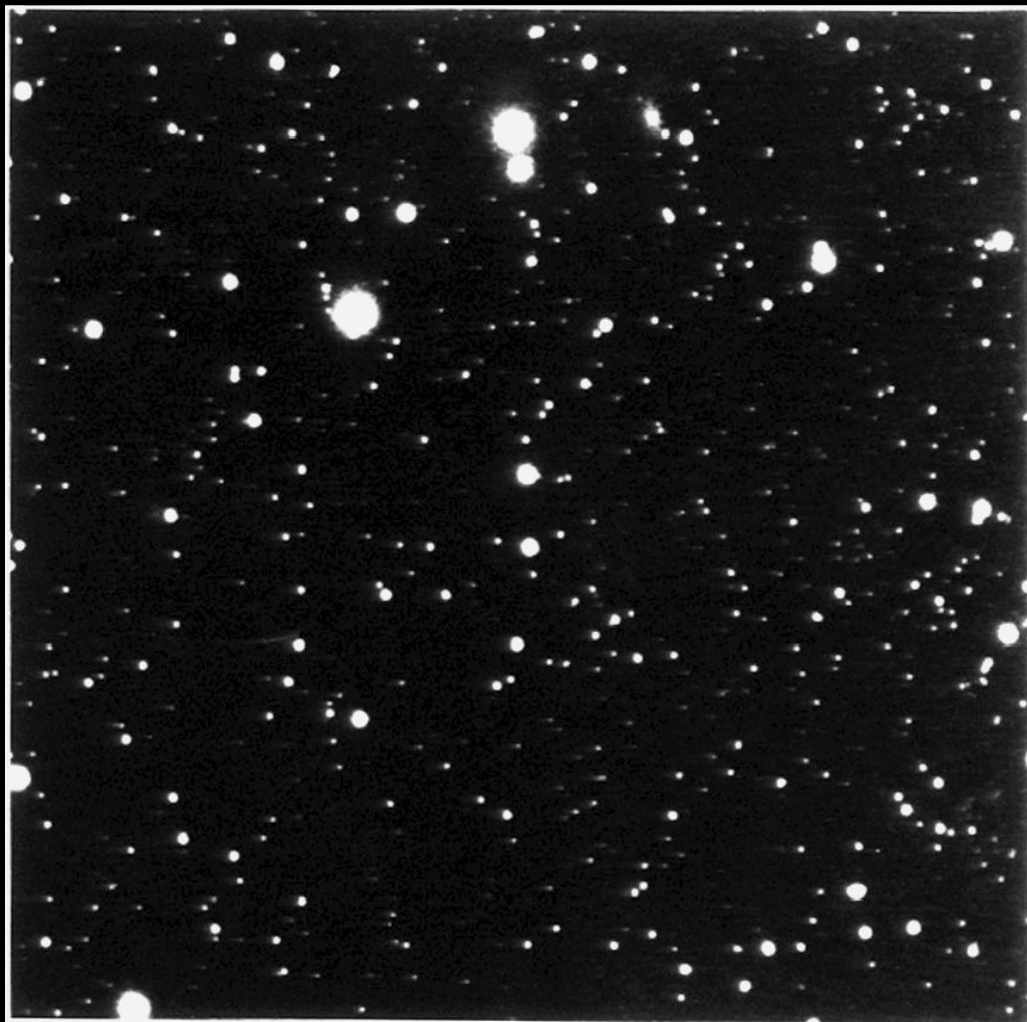
Percival Lowell



Clyde Tombaugh



- Orbital anomalies in Uranus could not be entirely explained by the presence of Neptune.
- Percival Lowell built the Flagstaff observatory in Arizona to search for Planet X
- Unfortunately he died before its discovery.



NINTH PLANET DISCOVERED ON EDGE OF SOLAR SYSTEM; FIRST FOUND IN 84 YEARS

LIES FAR BEYOND NEPTUNE

Sighted Jan. 21 After 25
Years' Search Begun by
Late Percival Lowell.

SEEN AT FLAGSTAFF, ARIZ.

Observatory Staff There Spots
It by Special Photo-Telescope
—Makes Thorough Check.

ASTRONOMERS HAIL FINDING

The Sphere, Possibly Larger
Than Jupiter and 4,000,000,000
Miles Away, Meets Predictions.

By The Associated Press.
FLAGSTAFF, Ariz., March 13.—In
the little cluster of orbs which scampers
across the sidereal abyss under
the name of the solar system there
are, be it known, nine instead of a
mere eight, worlds.

The presence of a ninth planet in
the retinue of the sun, long suspected,
was definitely announced here to-

New Planet Compared With Earth and Neptune

Size:

Earth—8,000 miles in diameter.
Neptune—32,000.
New Planet—8,000 or more.

Distance from Sun:

Earth—One astronomical unit.
Neptune—Thirty astronomical
units.

New Planet—About fifty units.

Speed of Revolution:

Earth—19 miles a second.
Neptune—3½ miles a second.
New Planet—From 1 to 2 miles
a second.

Time of Revolution:

Earth—One year.
Neptune—146 Earth-years (en-
tire revolution not yet ob-
served).

New Planet—Probably 300 to
600 years.

Note—These figures on the new planet
are tentative, based upon computations of
astronomers here on the Flagstaff an-
nouncement.

McDONALD RALLIES NAVAL CONFERENCE

Prime Minister Devotes Whole
Day to Talks With Heads of
All the Delegations.

PROHIBITION HAIL BY STAGG AS CHIEF ON POST-WAR Y

Chicago Athletic Direc-
tor Hails Stagg as
Chief Dry Witness in Sen-
ate Ending in Committee

DRY MEMBER ASSAIL

Celler Is Accused of "Ins-
ulting" Mrs. Peabody by Cha-
rles She Prompted Speak

ADJOURN FOR COOLIN

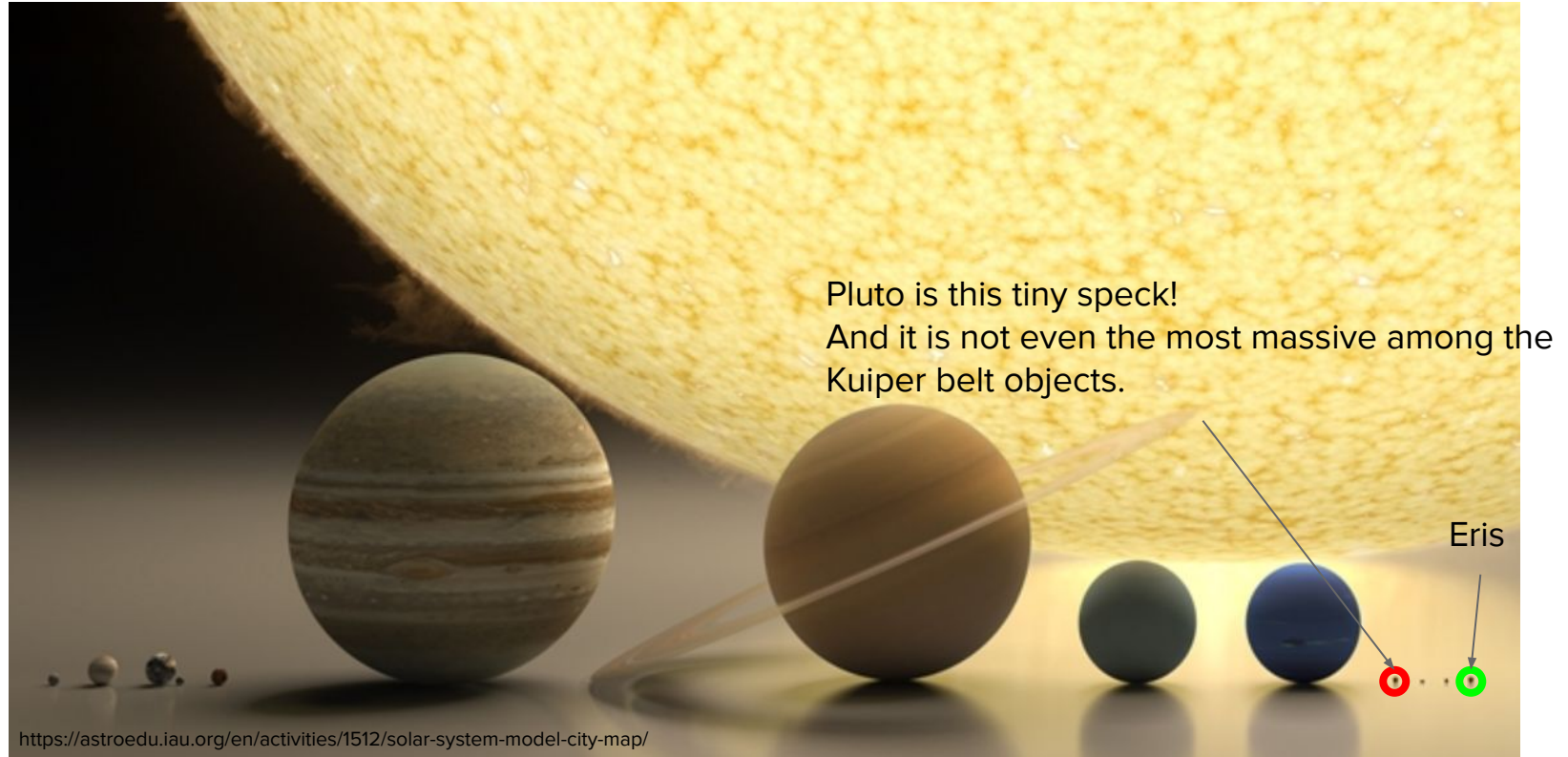
Sherwood Came Under
Attack as "Fanatic" by
Anti-Dry League

Special to The New York
WASHINGTON, March 13.—
Alonzo Stagg, veteran dir-
ector of athletics at the University
of Chicago, testified before the
Judiciary Committee today
improved status of the nation
under national prohibition.

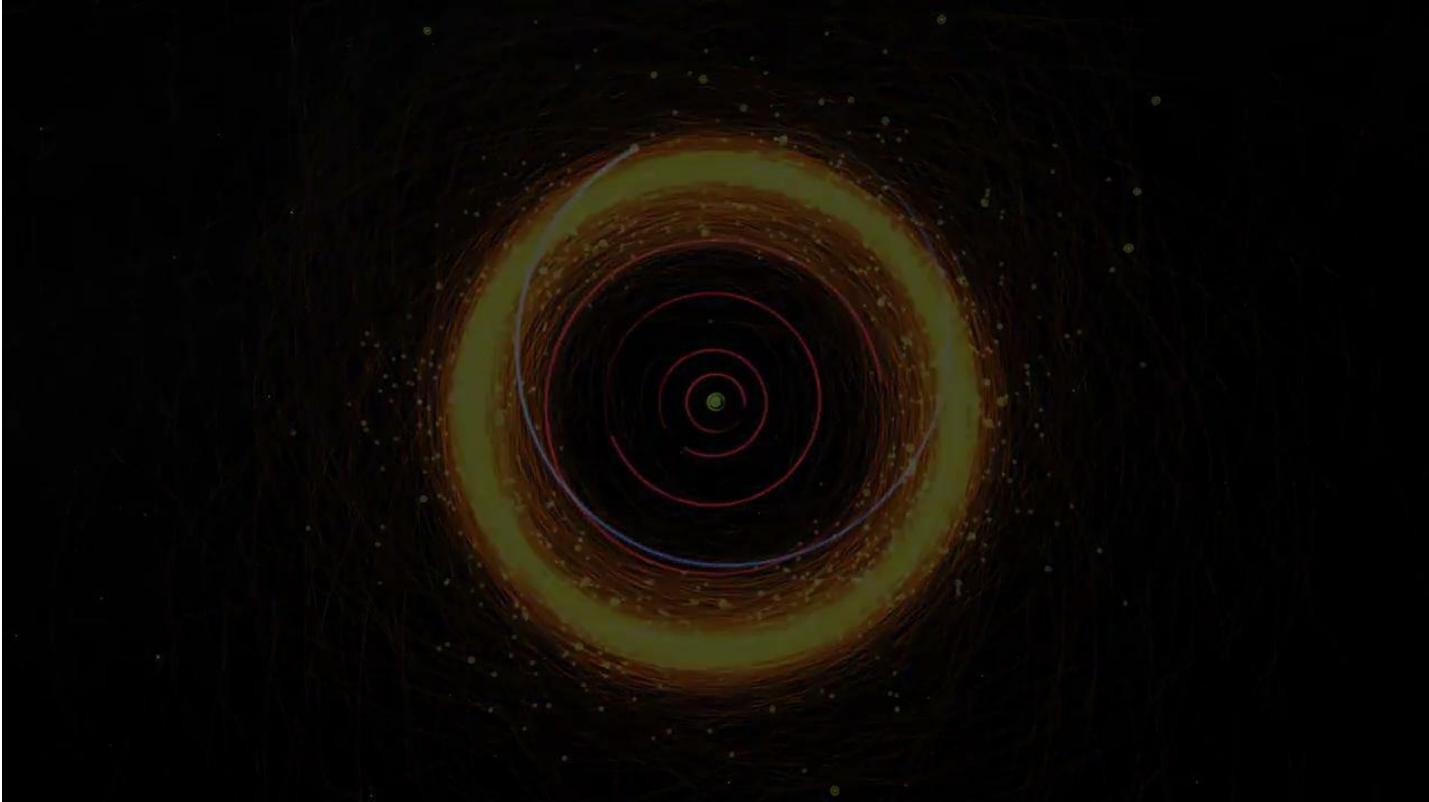
Mr. Stagg, who headed the
dry witnesses at today's he-
aring, testified that he was
the various modification bills
the committee:

"In my judgment, since pro-
hibition has been put into effect, hun-
dreds of thousands more children have
fairer start in life than in pre-
prohibition days. With the
down of the home life and the
complexities of new oppor-
tunities for being misled, I tremble

Pluto in context

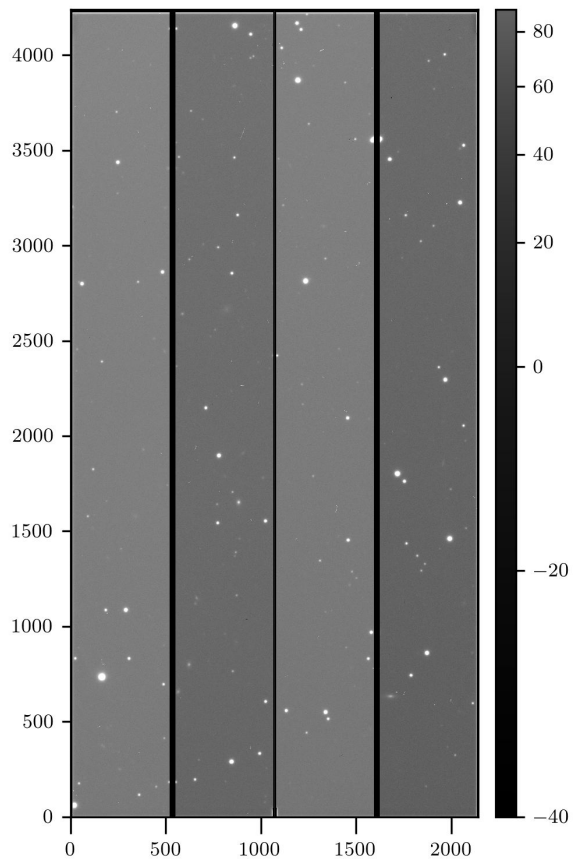


Pluto and the Kuiper belt



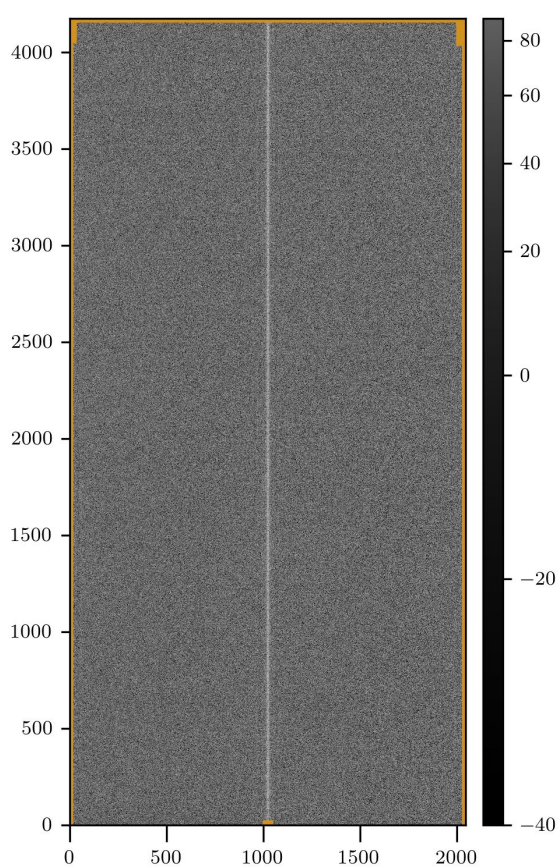
Credit: Michael Brown, Mark Subbarao, Patrick McPike

Image with zero exposure time

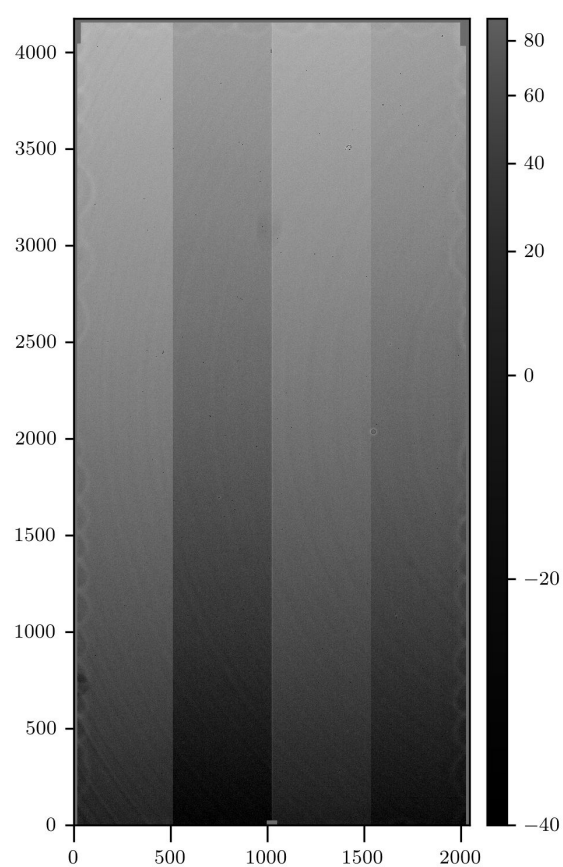


Raw image

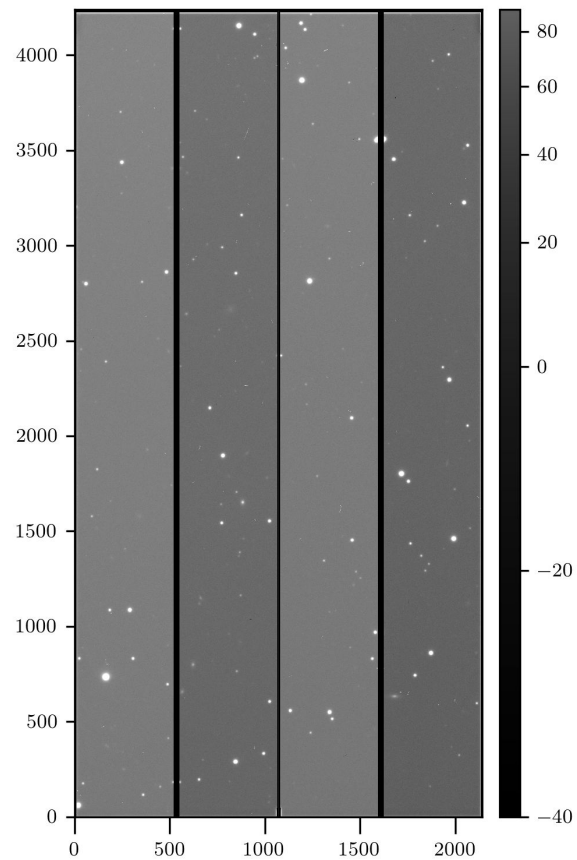
Image with uniform illumination



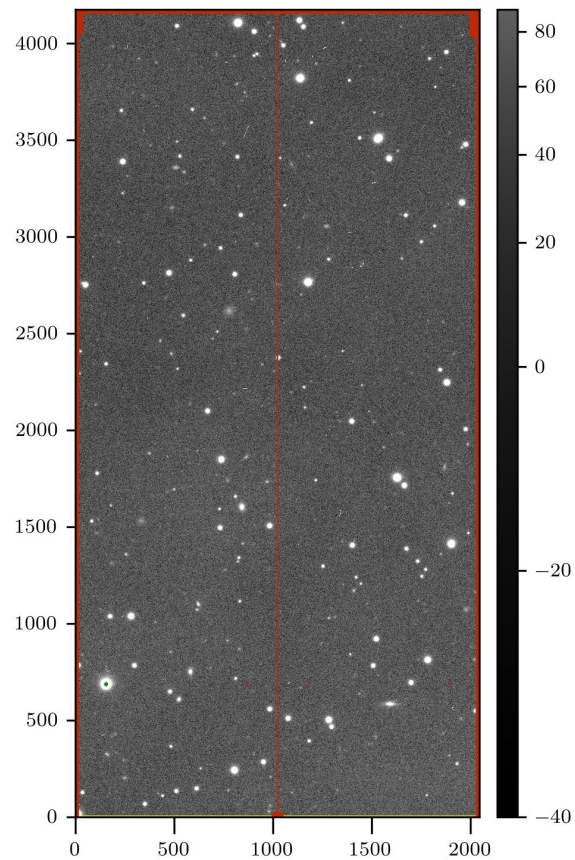
Bias image



Flat field

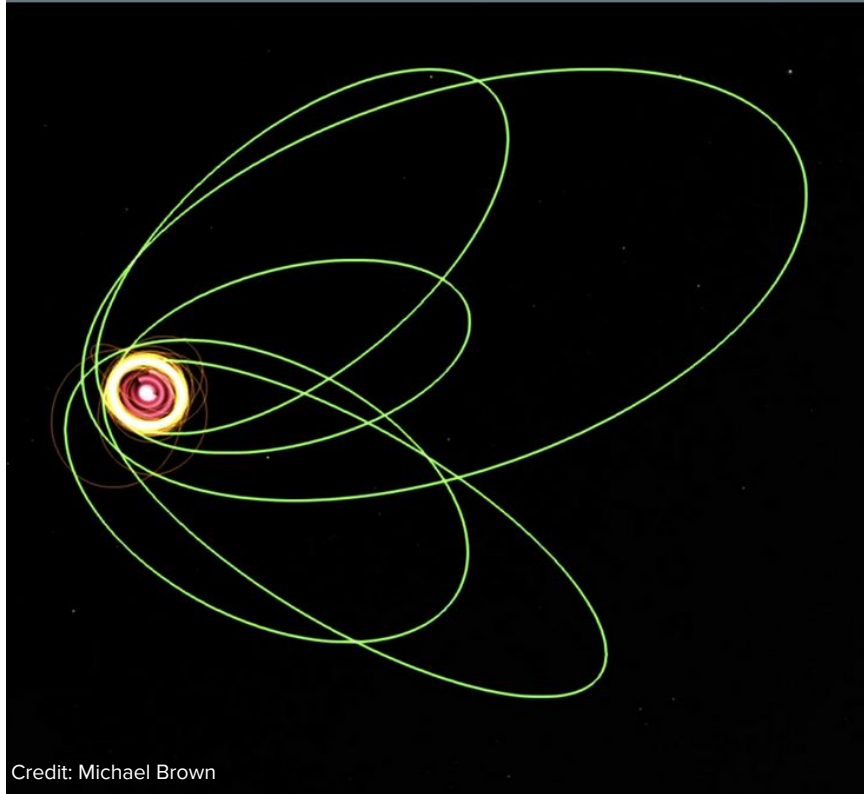


Raw image



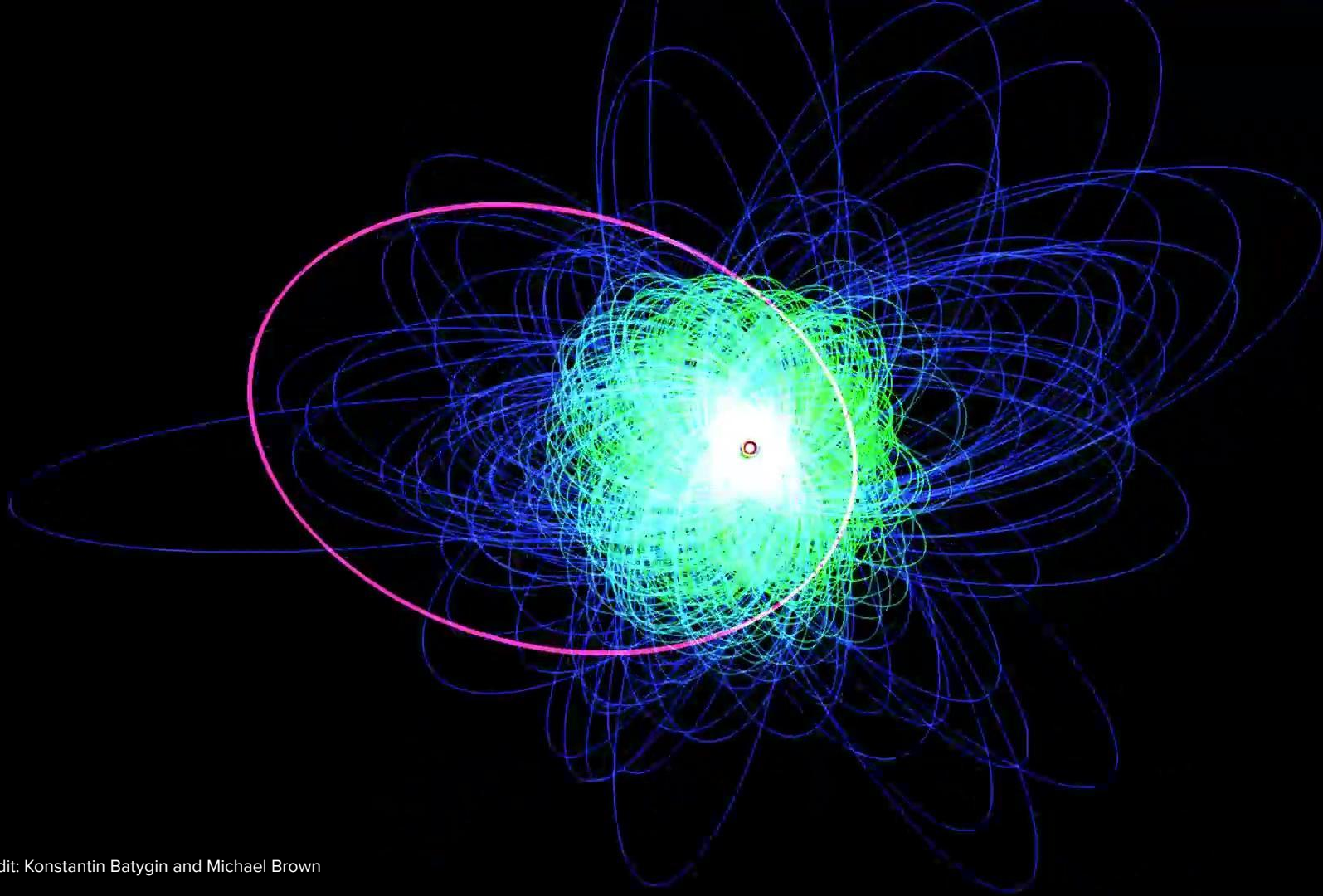
Calibrated image

Peculiar orbits in the Kuiper belt



Credit: Michael Brown

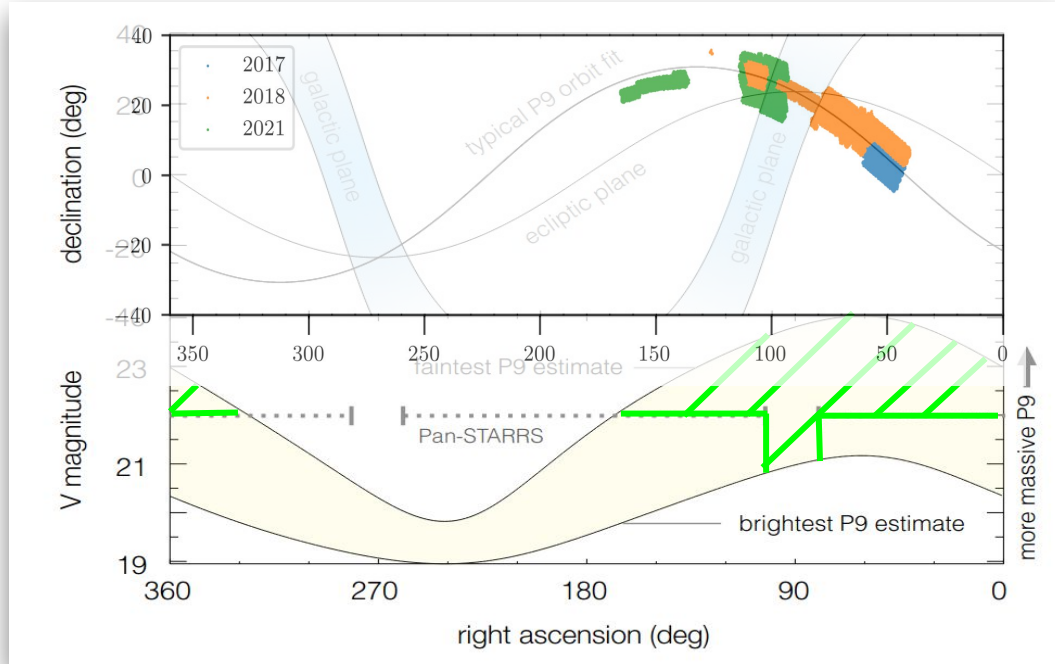
- Sedna, discovered by Mike Brown (Caltech) in 2004, and VP112 (Biden) discovered in 2012 had odd elongated orbits.
- As more such objects were discovered a pattern emerged.
- Objects with semi-major axes beyond 230 AU have peculiarly odd orbits.
- All tilted in one direction compared to the Sun as if someone is pulling them to one side.



Credit: Konstantin Batygin and Michael Brown



Data gathered thus far



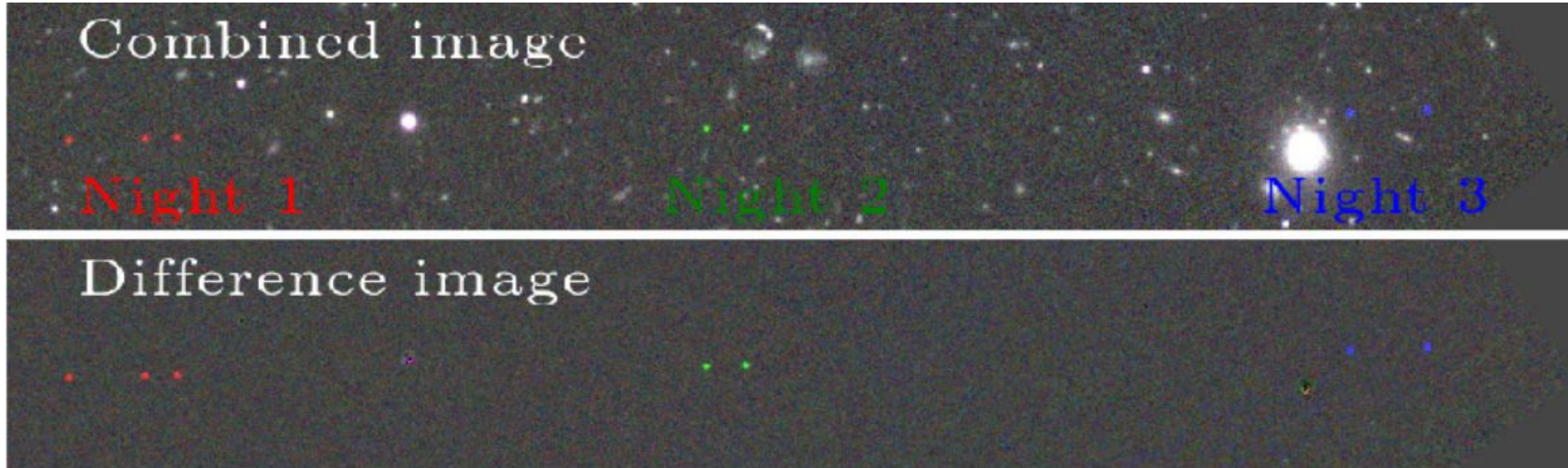
- Right ascension and declination can be thought of as longitudes and latitudes on sky to determine position
- Magnitude tells how bright an object is (smaller the magnitude brighter the object)
- The observed pointing are shown in color.



The search goes on!



Needle in a haystack!



- Lots of images with terabytes of data. Needs supercomputers to process the images.
- Clever algorithms like difference imaging help in finding moving objects.

Data processing pipeline

Raw images from
the telescope

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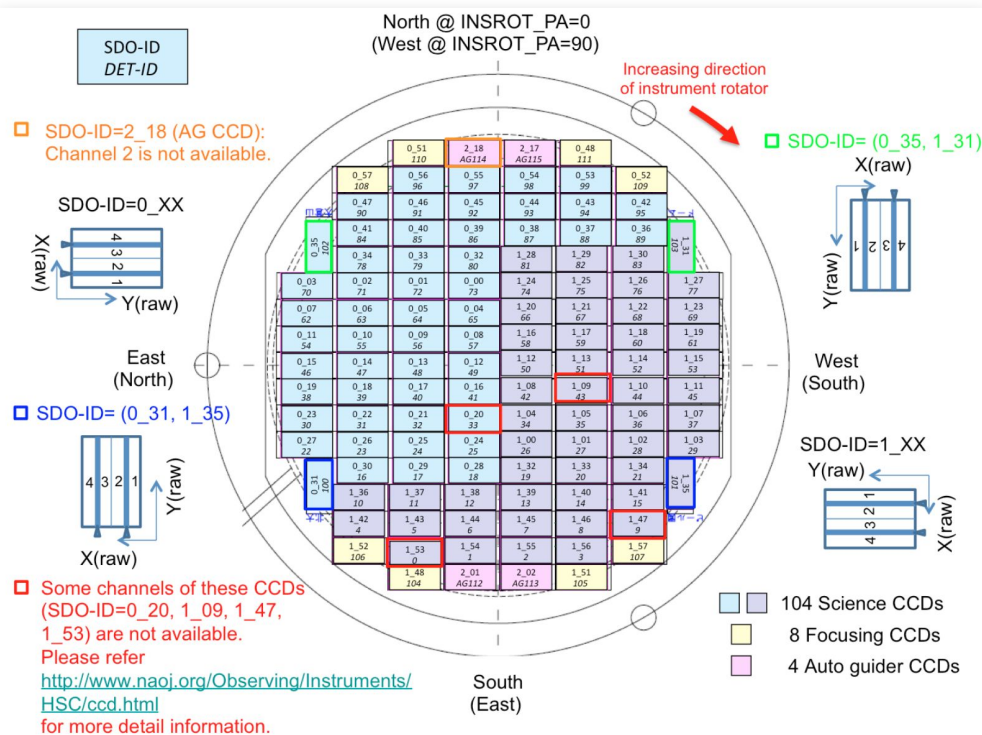
Joint c
within

plate images

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catalogs

Date	Raw	Calibrated	Injected	Differenced
20181204	18720	18414	17232	17051
20181205	15080	14593	13514	13467
20181206	19032	18829	17645	17337
20181207	16744	16579	16579	16433
20181208	35776	35316	35316	34824
20181209	35360	34859	34702	34271
20181210	34840	34344	34187	33835

Hyper Suprime-Cam detector



- Focal plane has 116 CCDs, 104 used for science, 8 are used for focussing, 4 for auto guidance.
- More than 2 GB of data every 90 seconds, > 2500 exposures in total.
- Worry about chip gaps and failed chips.

