

PHY 517 / AST 443:

Observational Techniques in Astronomy

Lecture 3:
CCDs /
FITS files

Photon detectors: CCDs and CMOS

CCDs

- CCD: “charge-coupled device”
- CCDs are the detectors of choice over much of the electromagnetic spectrum (X-rays to infrared) until recently and remain for high sensitivity applications
- replaced photographic plates
- similar to detectors found in digital cameras

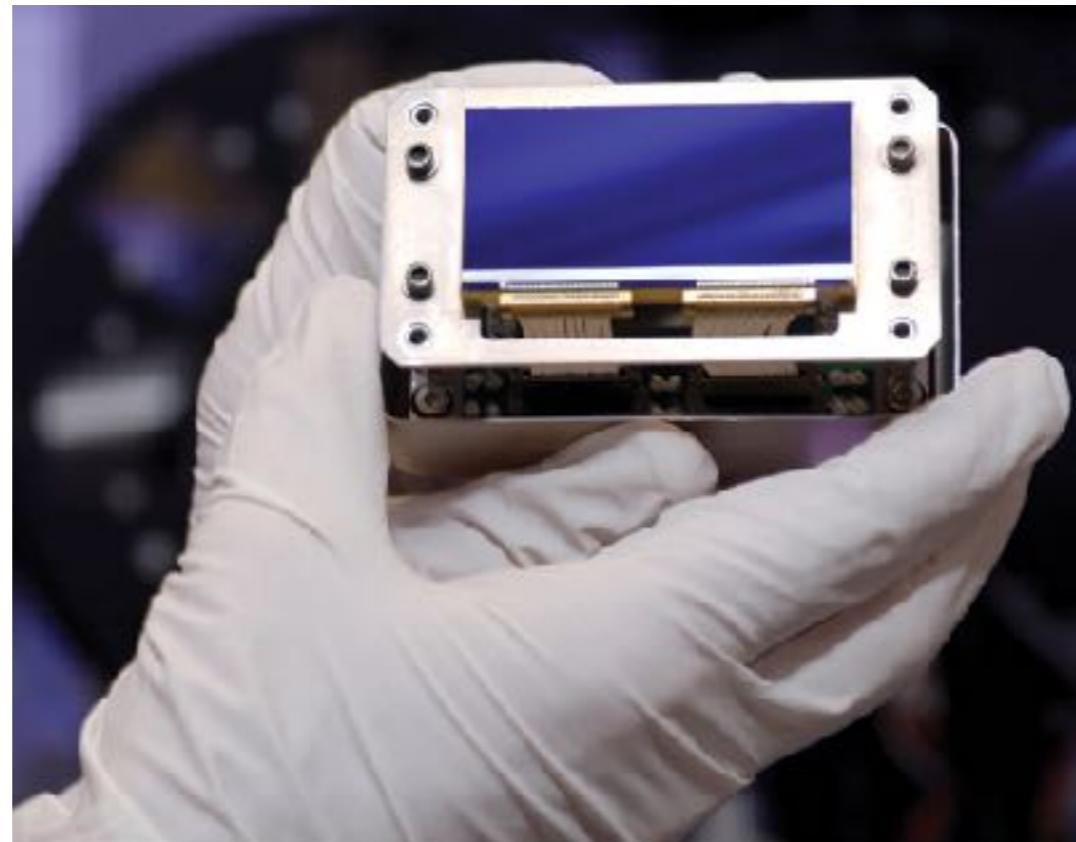


Figure 3. Kepler CCD in handling jig.

e2v

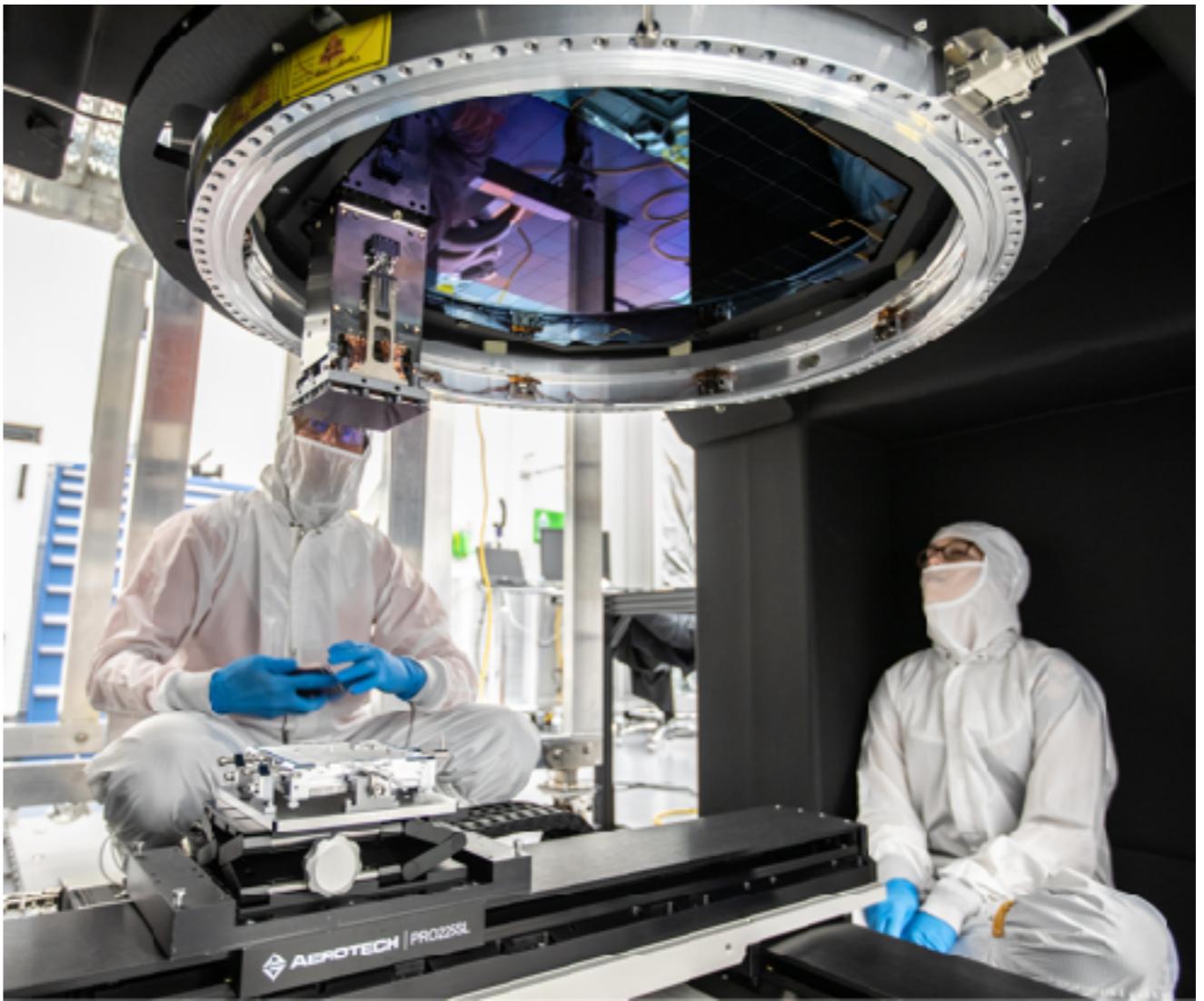
CCDs - Advantages

- (nearly) linear response
- high sensitivity
- low noise (especially when cooled)
- built-in digitization

$$N_{\text{electrons}} \propto N_{\text{photons}}$$

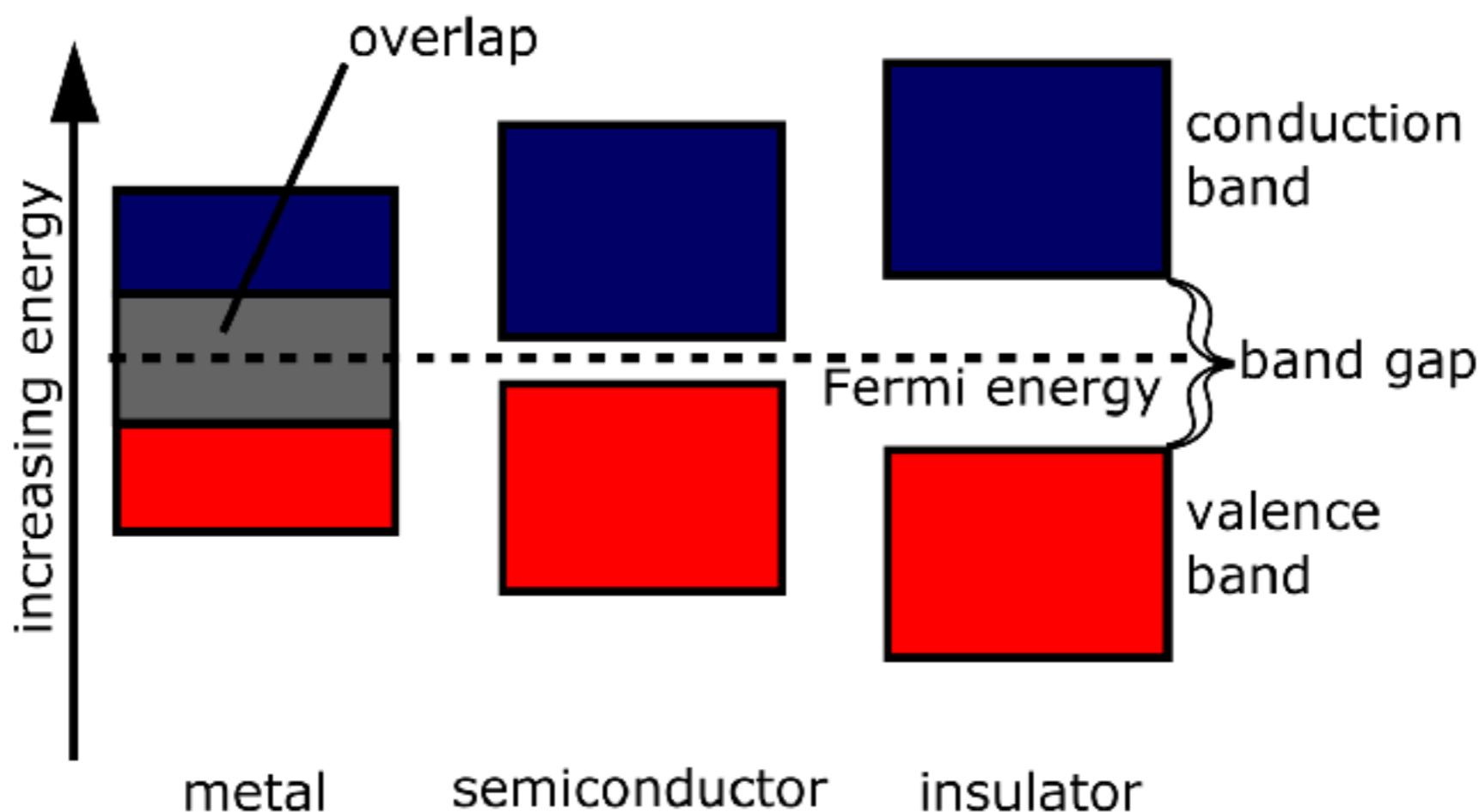
LSST Camera at SLAC

<https://www6.slac.stanford.edu/news/2020-09-08-sensors-world-largest-digital-camera-snap-first-3200-megapixel-images-slac.aspx>



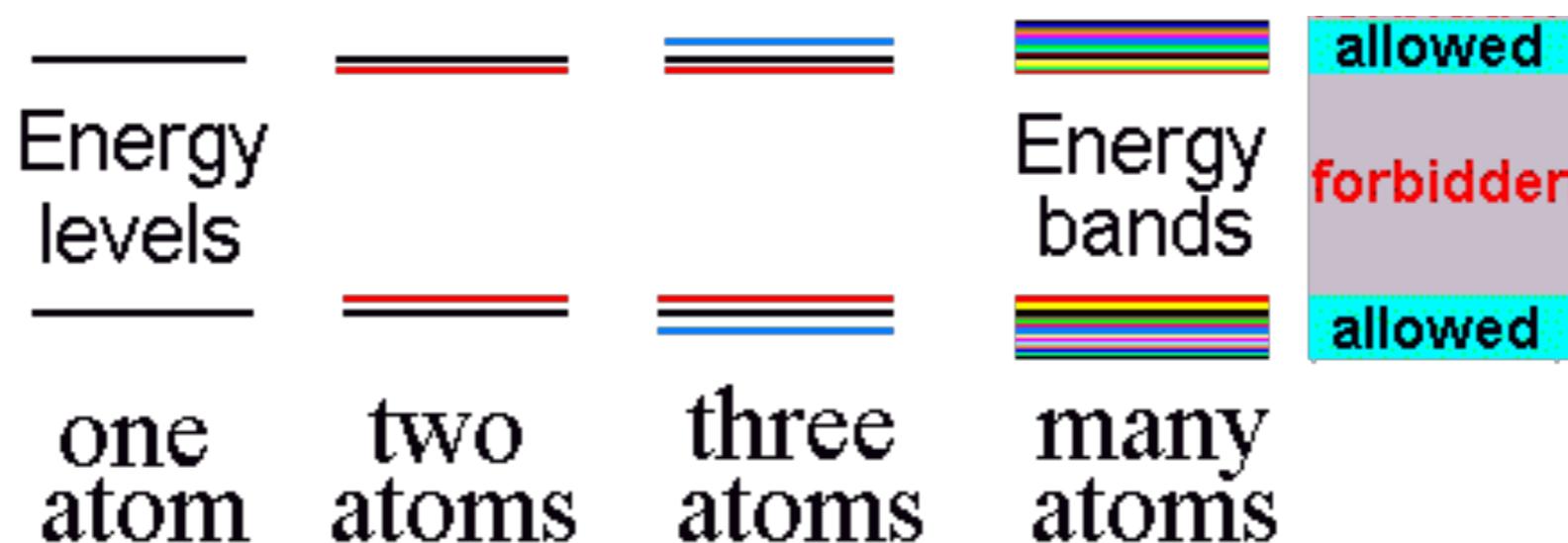
Semi-Conductors

- CCDs are made of semi-conducting silicon wafers
- key feature: small energy gap between “valence band” (energy levels of outermost bound electrons) and “conduction band” (energy levels of free electrons)



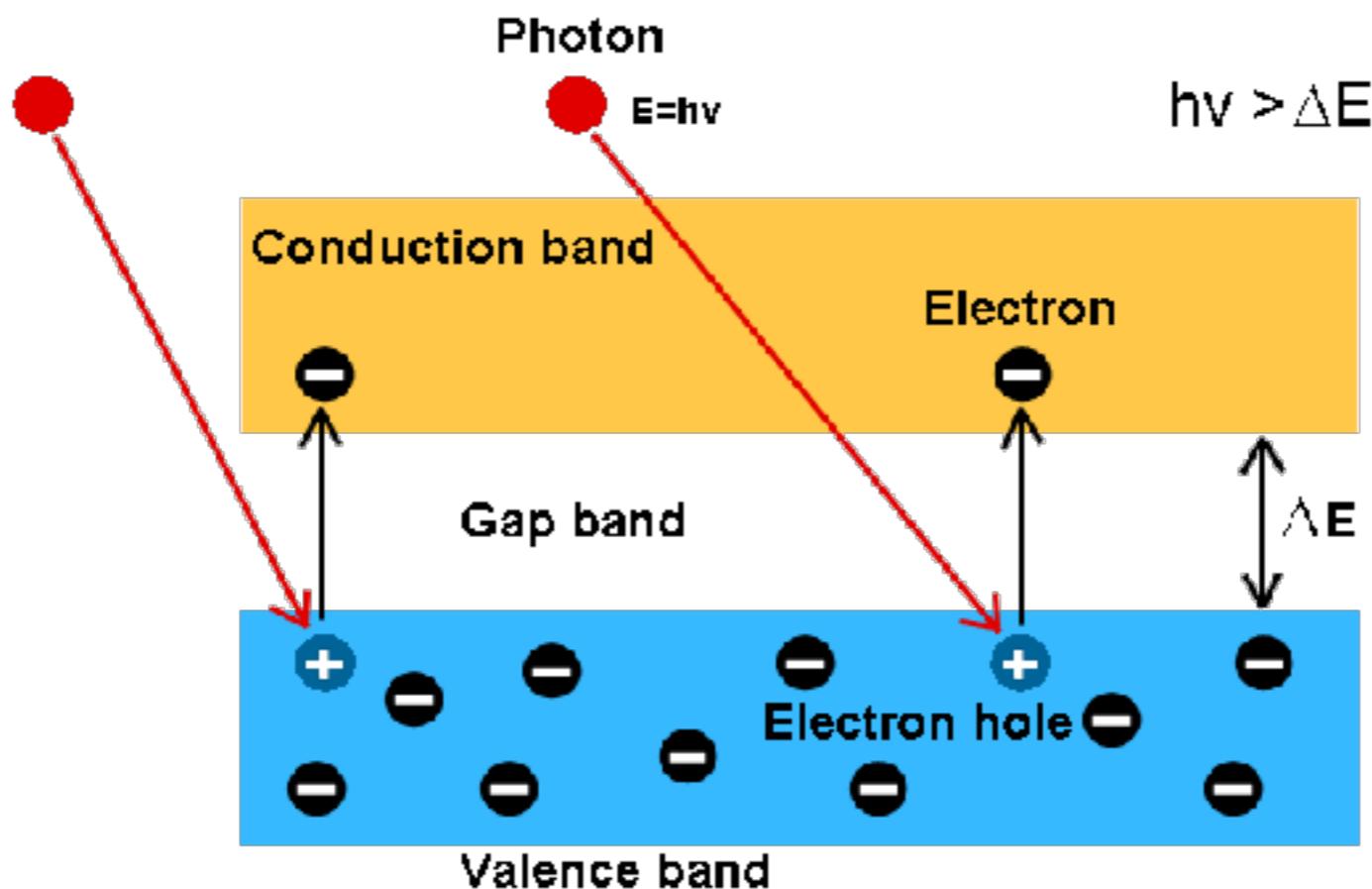
Why energy bands?

- single atom: discrete energy levels
- two atoms:
 - outer electron orbitals overlap
 - Fermi exclusion principle still holds → energy levels split to accommodate electrons
- many atoms: energy bands



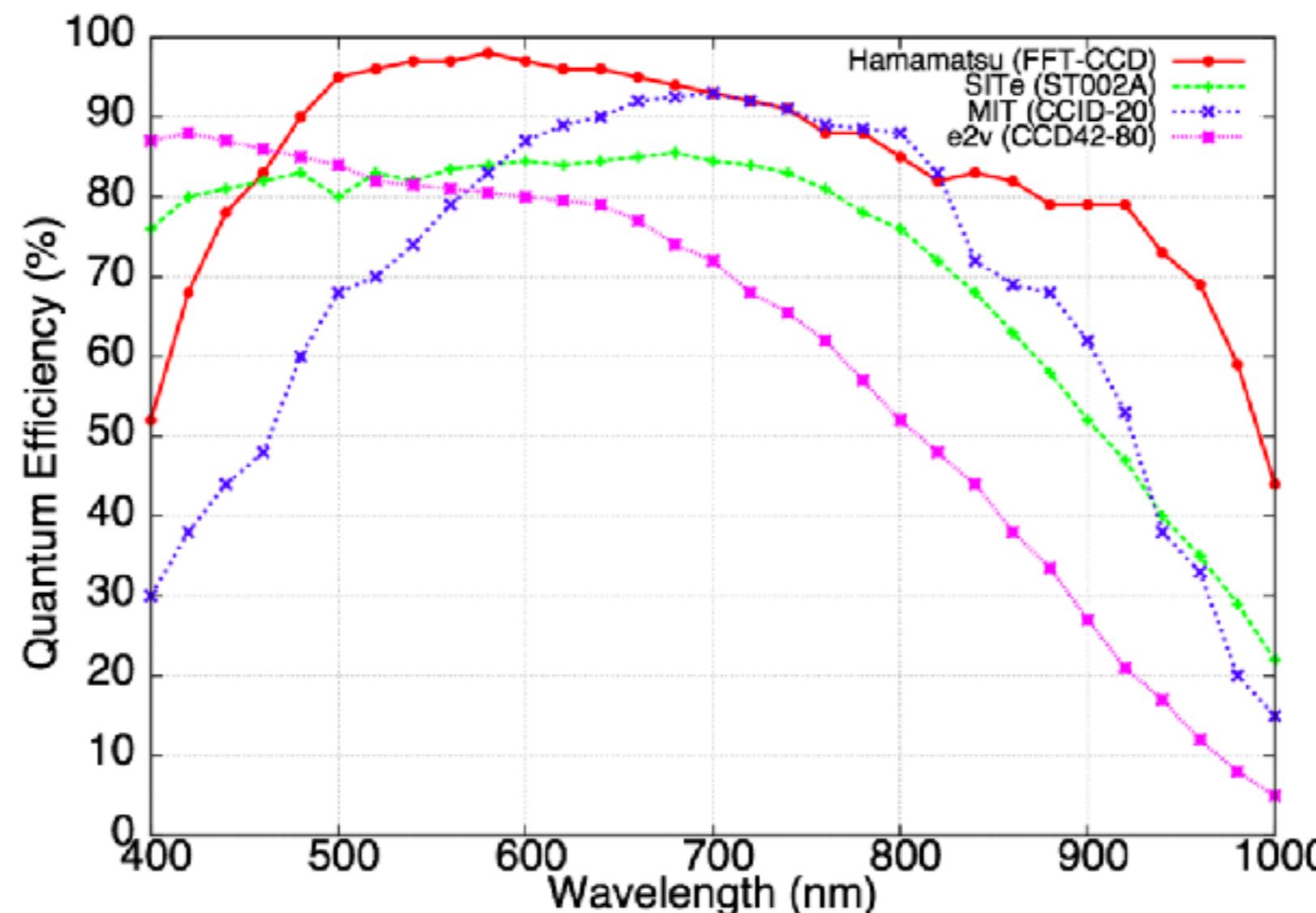
Photoelectric effect

- light is quantized, “photons” $E = h\nu$
- when a photon is absorbed, the energy is transferred to an electron → “jumps” into conduction band



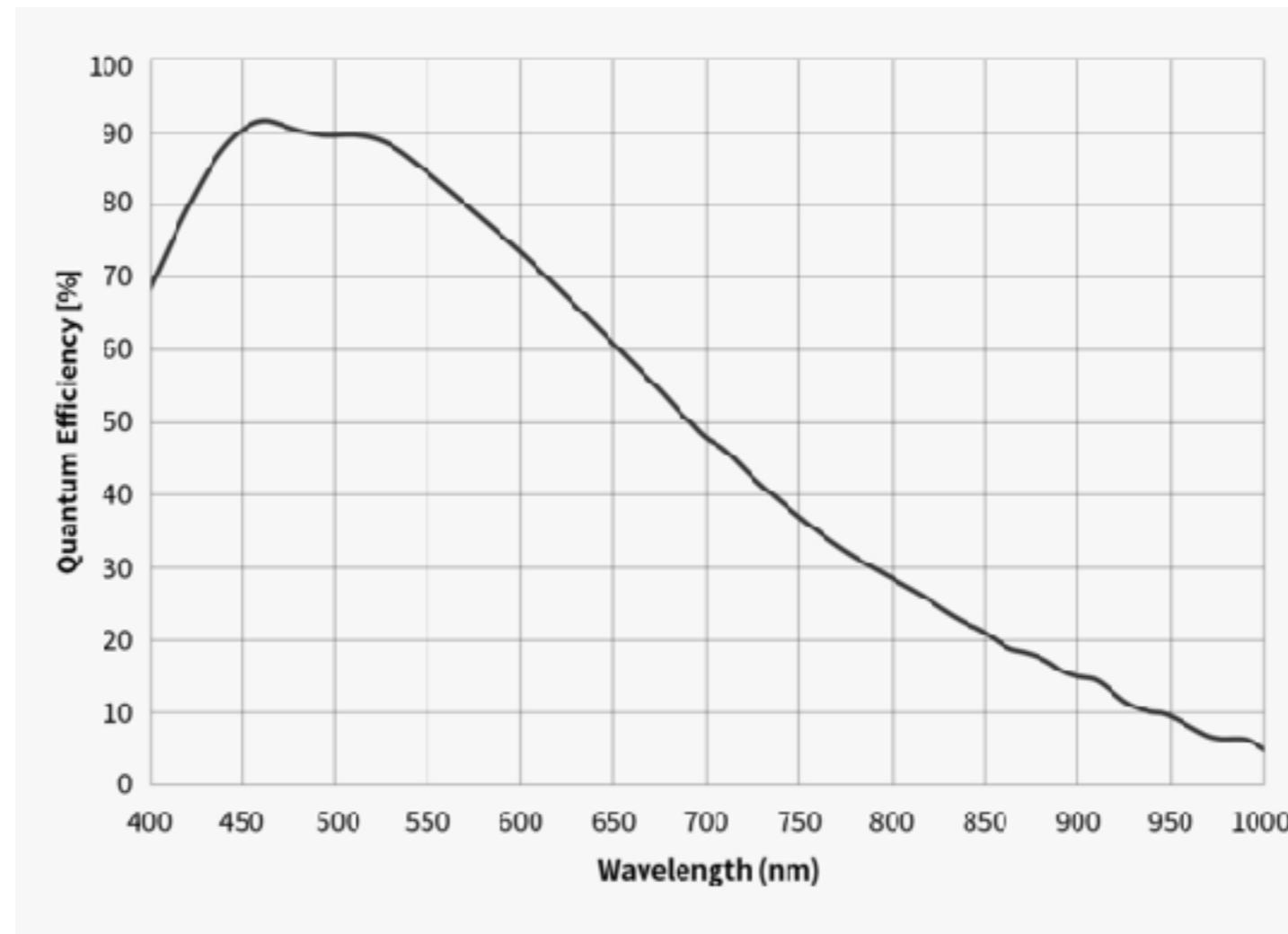
CCD Quantum Efficiency (QE)

- fraction of photons that are absorbed
- depends on wavelength
- different technologies lead to red vs. blue optimized CCDs



CCD Quantum Efficiency (QE)

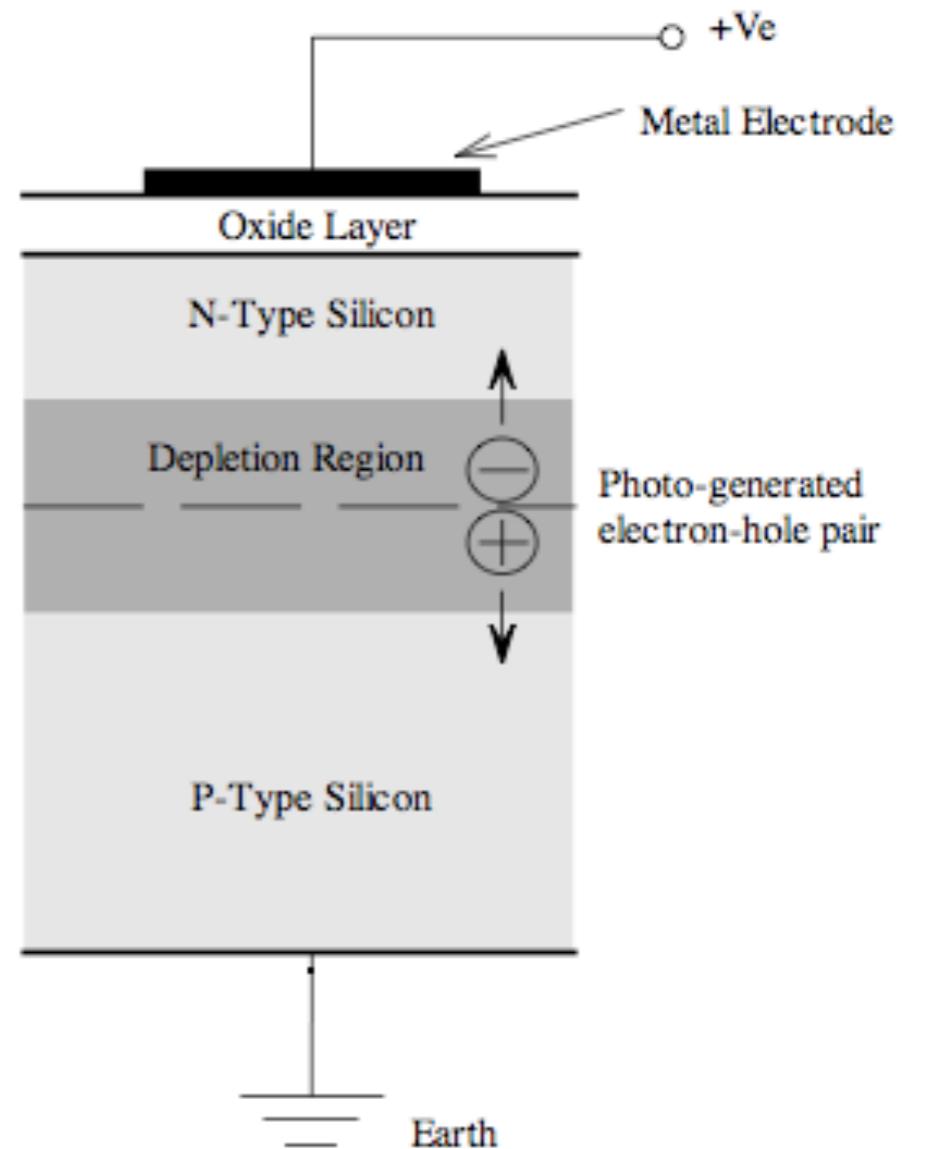
- fraction of photons that are absorbed
- depends on wavelength
- different technologies lead to red vs. blue optimized CCDs



Our camera

One pixel

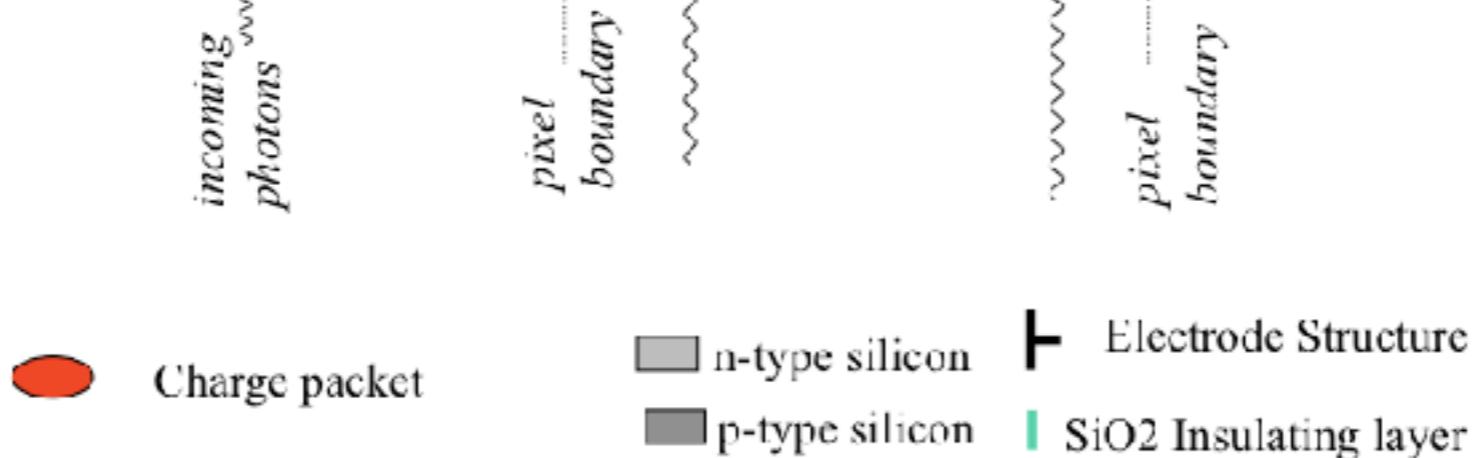
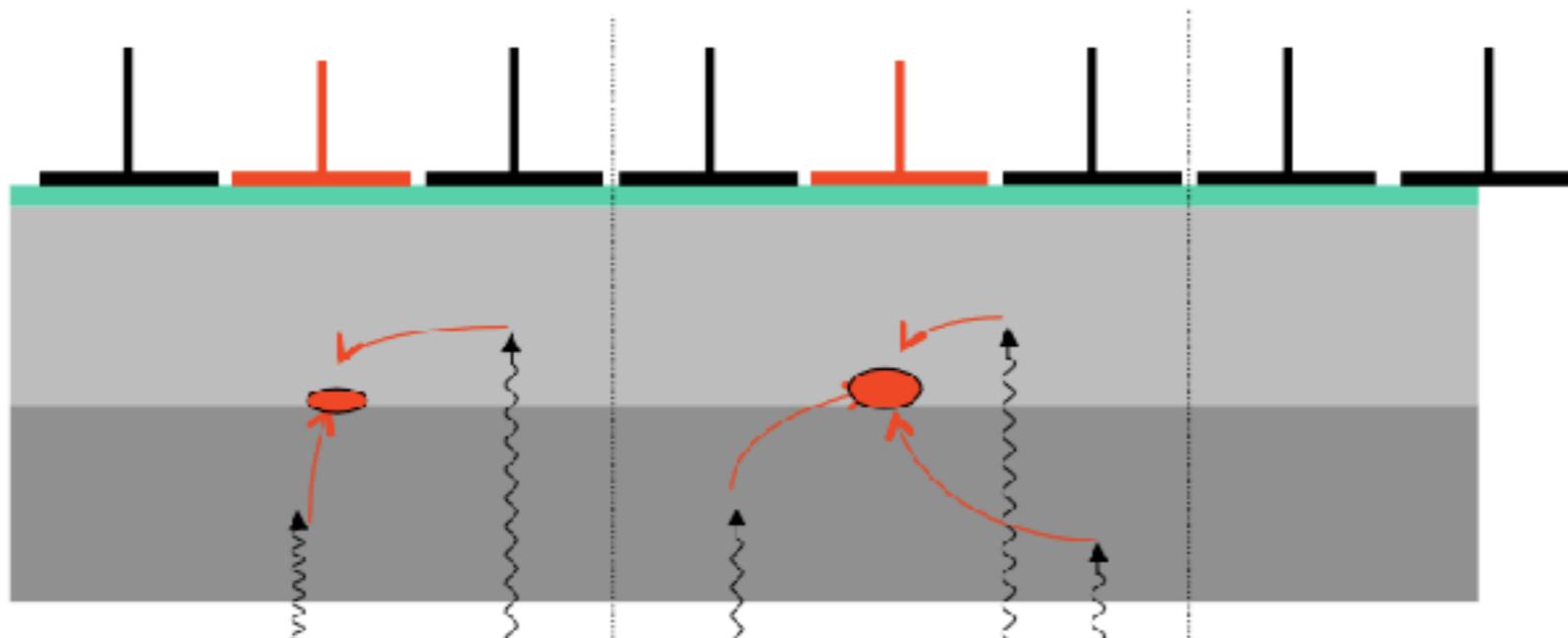
- apply an electric field to keep electrons / holes separated



Microsoft

Many pixels

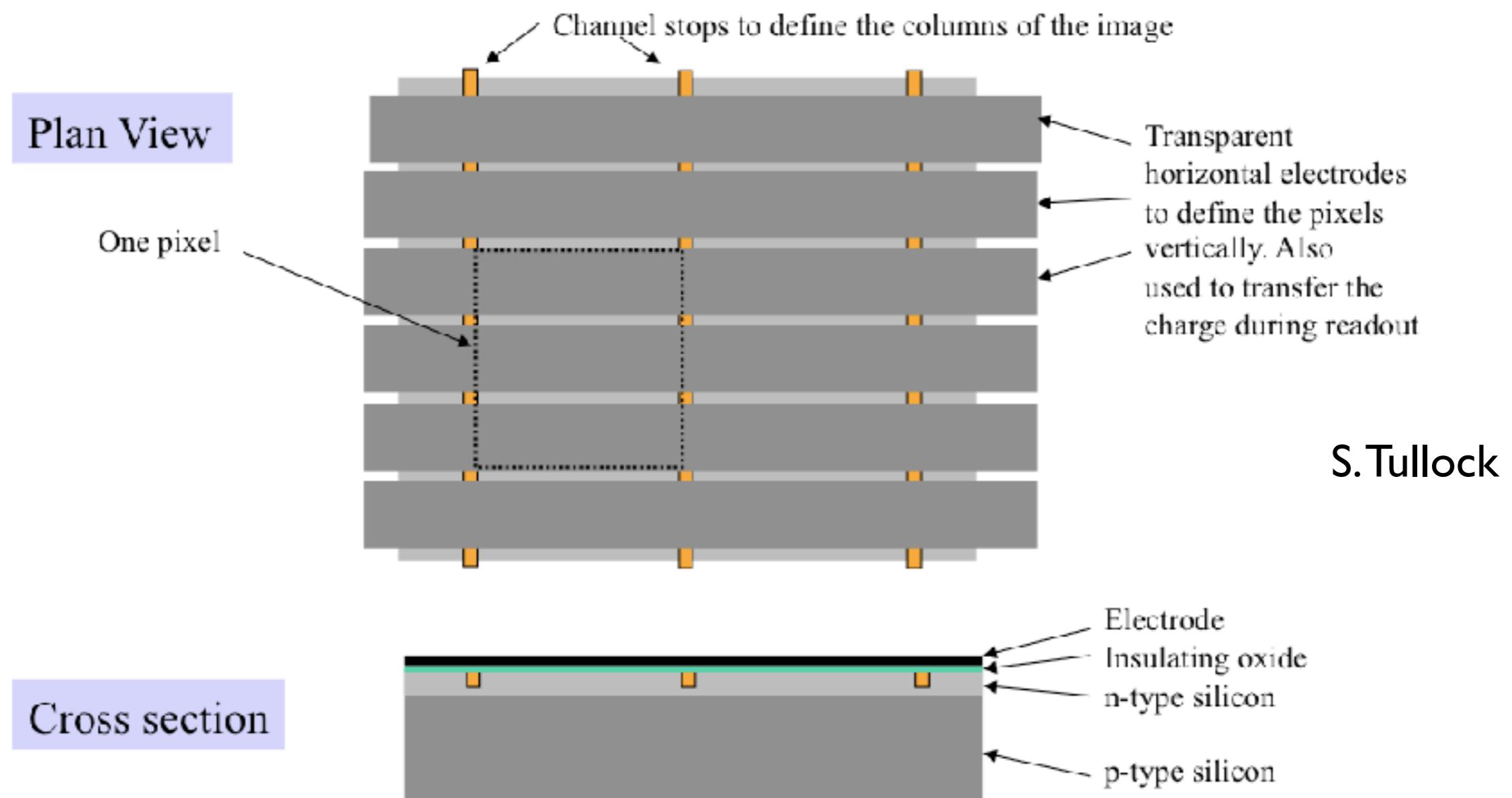
- pixels are defined by the electric field generated by the applied electrodes



S.Tullock

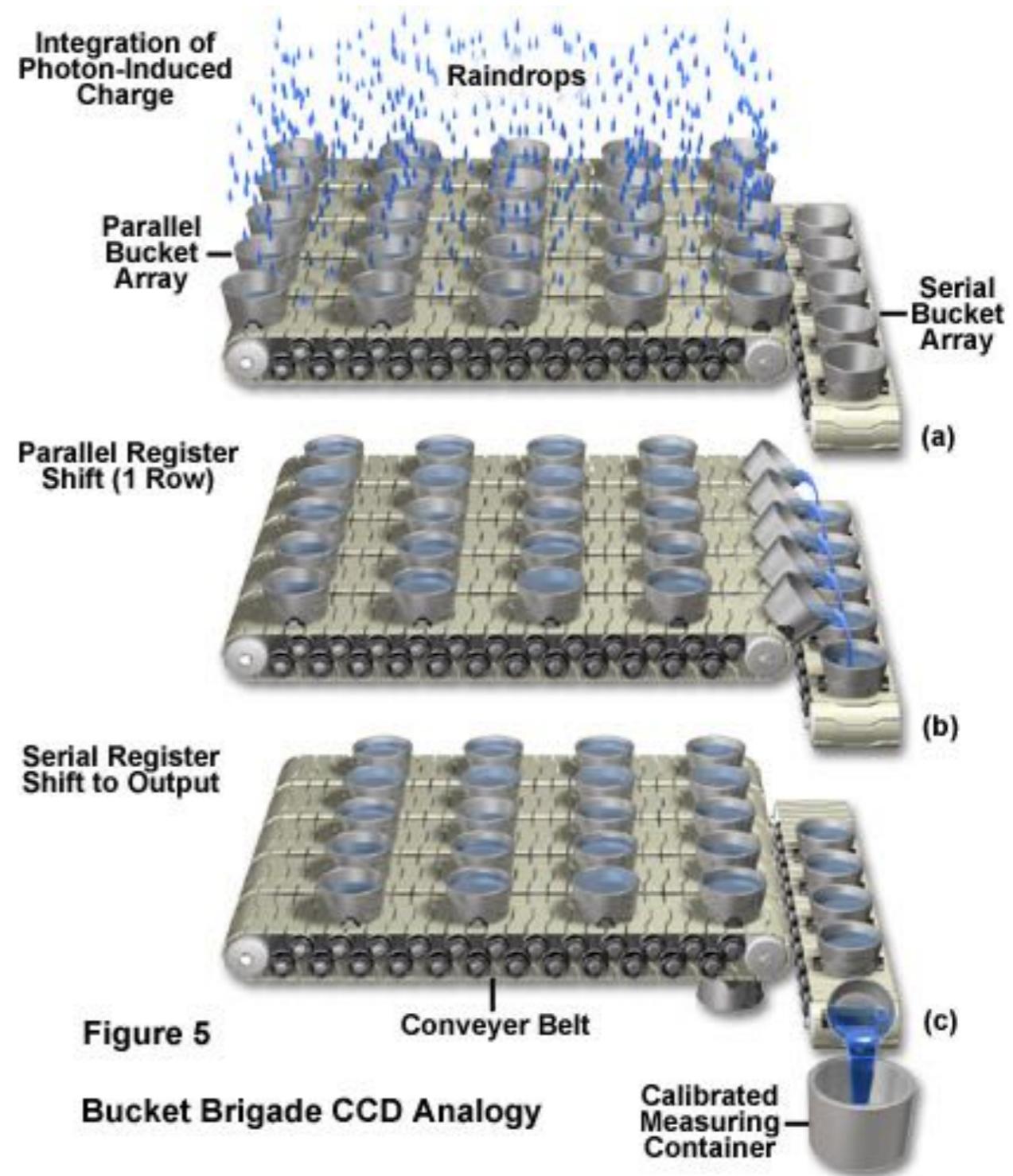
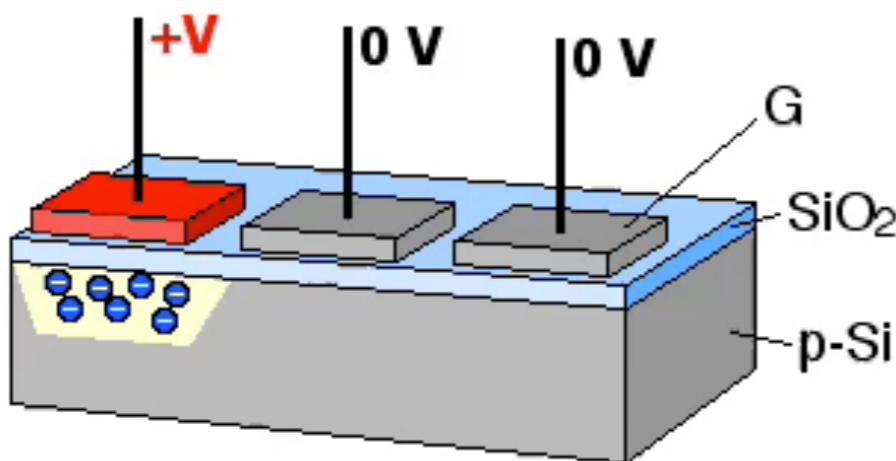
Many pixels

- ... and by insulator strips between columns



Reading out CCDs

- “rainbuckets on conveyor belts” analogy
- 1 conveyor belt = 1 CCD column
- in practice: modulate the electric fields to move pixel charges

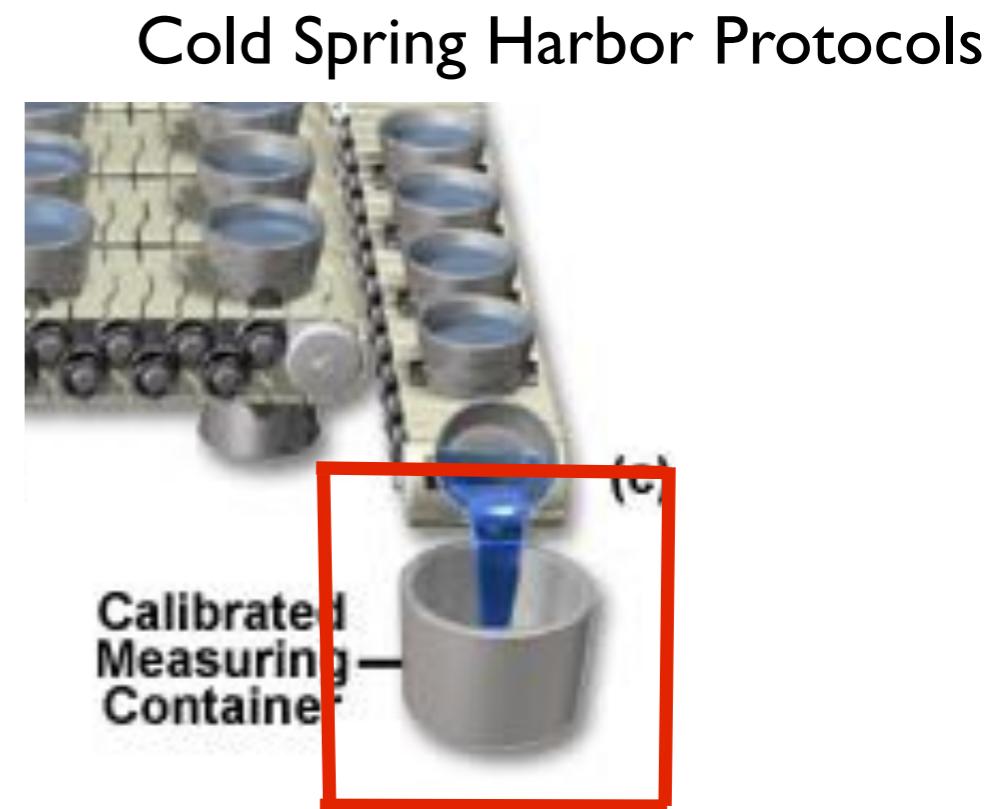


Bucket Brigade CCD Analogy

Cold Spring Harbor Protocols

Assembling the Image

- each charge collection is passed to an amplifier and analog-to-digital converter (ADC)
- final output: “counts” or ADUs (analog-to-digital units) → *integer value*
- can apply rescaling: “gain”

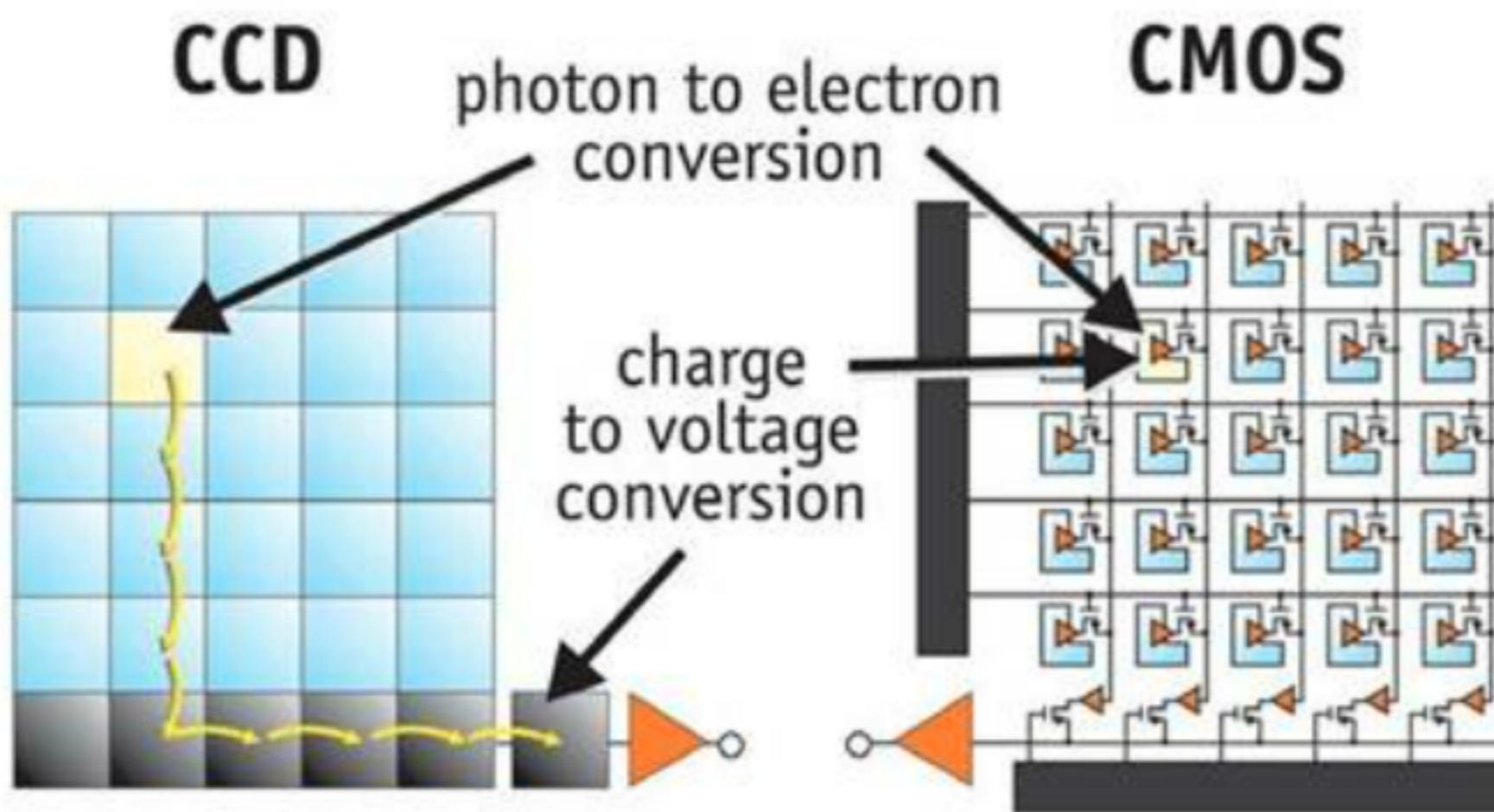


$$\text{gain } G = \frac{N_{\text{electrons}}}{N_{\text{counts}}}$$

CMOS

(Complementary Metal-Oxide-Semiconductor)

Each pixel has its own amplifier and circuitry



CCD vs CMOS

CCD+

- High uniformity
- Handles over-exposure well (overcome by now)

CMOS+

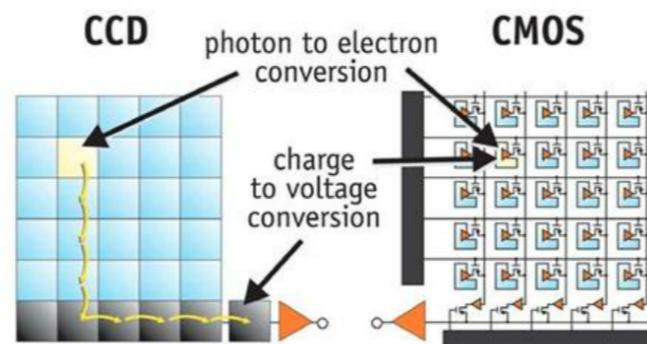
- High speed
- lower power consumption
- lower cost
- on-chip processing

CCD-

- slower readout speed
- high power consumption
- high cost

CMOS-

- higher noise
- lower uniformity



Full Well Capacity

- each pixel can only hold a limited charge → *full well capacity*, of the order of 100 000 e⁻
- ADCs have a maximum output value, e.g. 16-bit = 2^{16} = 65536 counts
- gain should be chosen roughly so that ADC maximum ~ full well
- typically, gain ~ 2-4

Measured number of counts

$$N_{\text{electrons}} \propto N_{\text{photons}}$$

- we want to measure N_{photons} (or, flux)
- our CCD returns N_{counts}
- what else contributes to $N_{\text{counts}}?$

Bias level

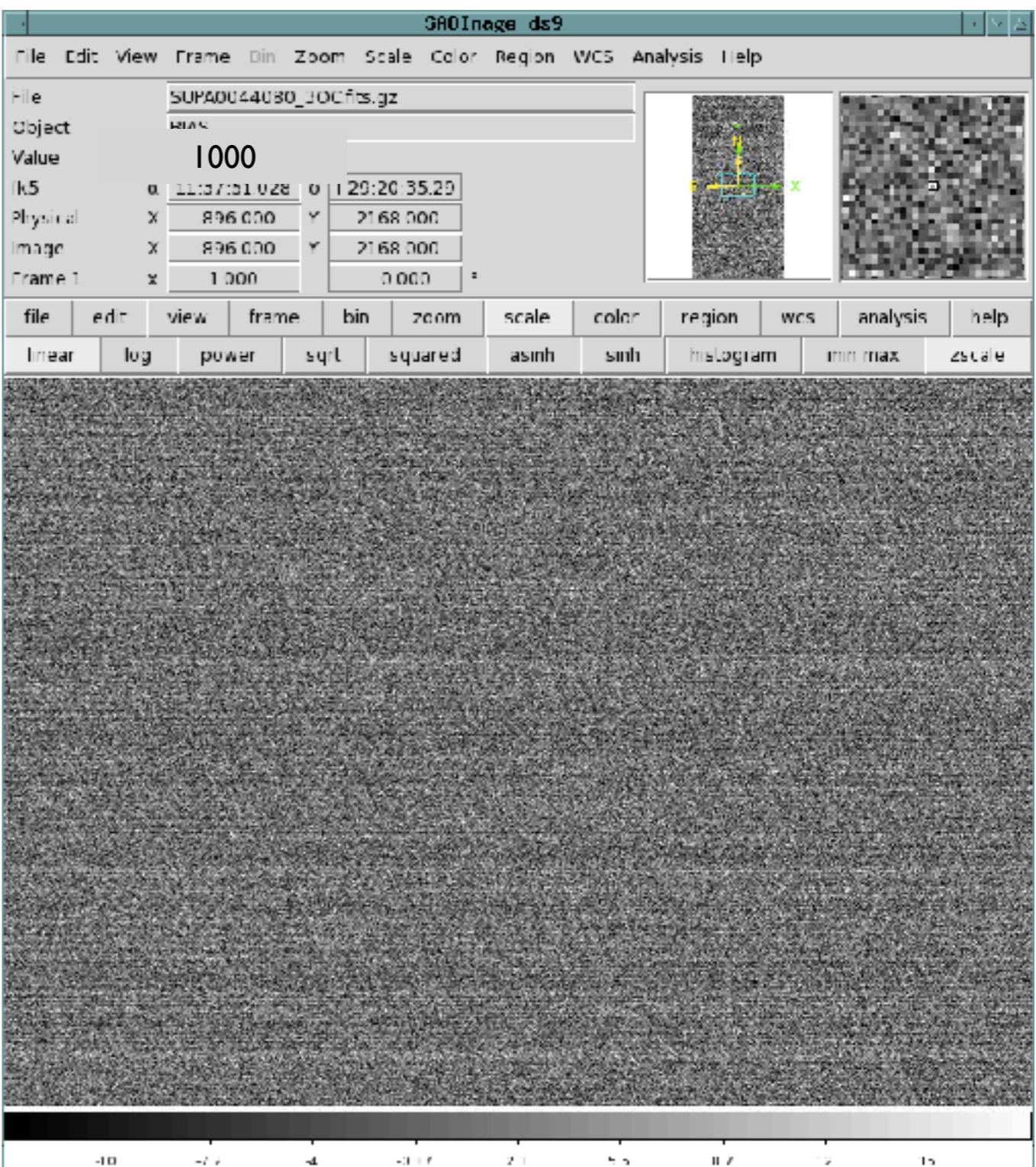
- **bias level**: an electronically induced offset which ensures that the ADC always gets a positive input
- the bias needs to be **subtracted** so that the counts are proportional to the signal
- note: the bias level is not a “counting process”, i.e. the standard deviation of the bias values (i.e. the read-out noise) is NOT $\text{sqrt}(N_{\text{cts}}[\text{bias}])$

Read-out noise

- **read-out noise:** noise produced by various electronics during read-out, e.g. the amplifiers
- the slower the read-out, the lower the read-out noise
- note: this is a noise term, i.e. it adds stochasticity to the measurement. it cannot be subtracted per se.

Bias images

- images with 0s exposure time
- single bias frame: pixel values scatter around the bias level, width of this distribution is the read-noise
- master bias frame (median of many bias frames): read-noise is averaged out, remaining structure is due to electronics



Overscan region

- problem: the bias level may not be stable
- images on large astronomical cameras come with an *overscan* region
- each row is clocked out more often than there are physical pixels
- can be used as an in-situ estimate of the bias level
- use the extra pixels to estimate the bias level of each row; subtract it from entire row
- the overscan is subtracted from all images (including bias frames)

Dark current

- the energy gap in the semi-conductor is small → thermal noise leads to extra charge accumulation
- proportional to the exposure time
- cooling the CCDs significantly mitigates dark current
- professional astronomical CCDs cooled to -100°C → almost no dark current

Dark frames

- **dark frame:** images taken with closed shutter
- similar to bias frames; need to be subtracted
- (subtracting non-bias-corrected darks subtracts the bias, too)
- our cameras have no overscan and substantial dark current → we will use dark frames instead of bias frames
- *Q: What temperature and exposure time do the dark frames have to have?*

Flat-field

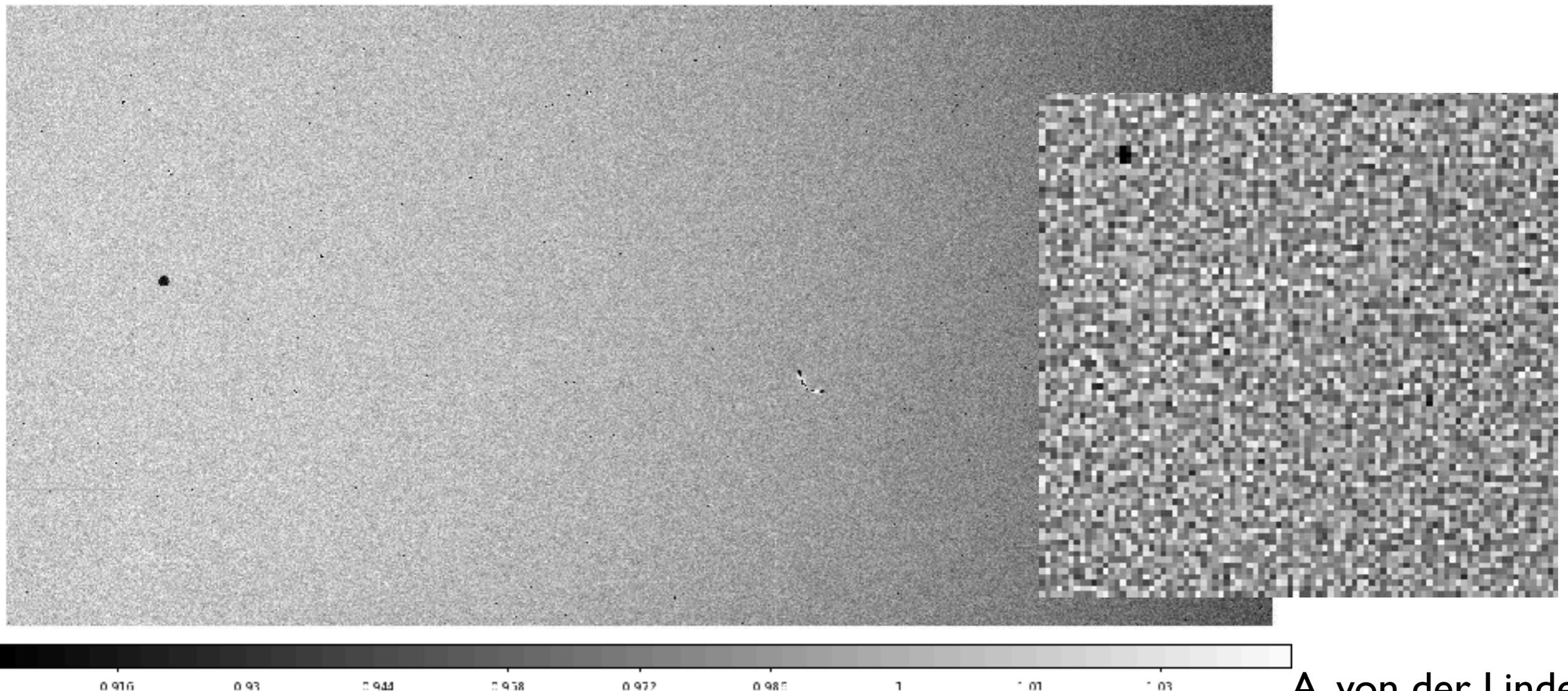
- the pixels in a CCD do *not* have uniform sensitivity
- due to variations in silicon crystal, electric field, pixel size, illumination (vignetting)

$$N_{\text{electrons}} = A_{ij} N_{\text{photons}}$$

- A_{ij} different for each pixel
- need to correct for differences for meaningful measurements

Flat-field

- flat-field: take an image of a spatially uniform source of light (e.g. the twilight sky, or a screen in the dome)
- input signal (N_{photons}) is the same for each pixel; variations in N_{counts} are due to different sensitivities



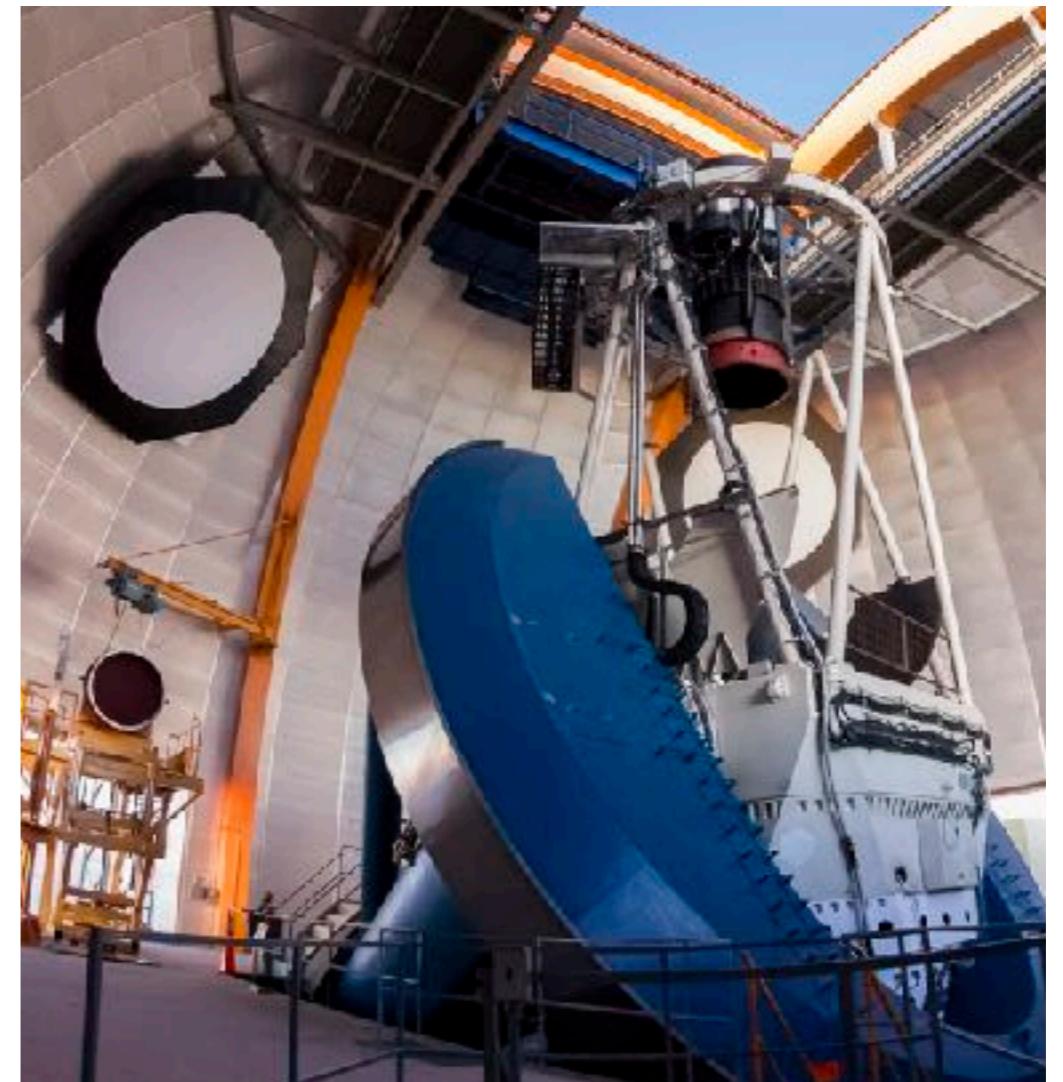
Flat-field

- flat-field is a *multiplicative* correction (unlike bias / dark)
- in practice: take a series of flat-field images
- correct each flat image by the appropriate dark frame
- average the flat-field images (reduces counting noise)
→ master flat-field
- ... *and then what?*

Types of flat fields

dome flats:

- ✓ easy
- ✓ constant conditions
 - not entirely uniform
 - different spectrum than astronomical objects



A. von der Linden

Types of flat fields

twilight flats:

- ✓ same “source”
- ✓ almost uniform
- variable
- difficult

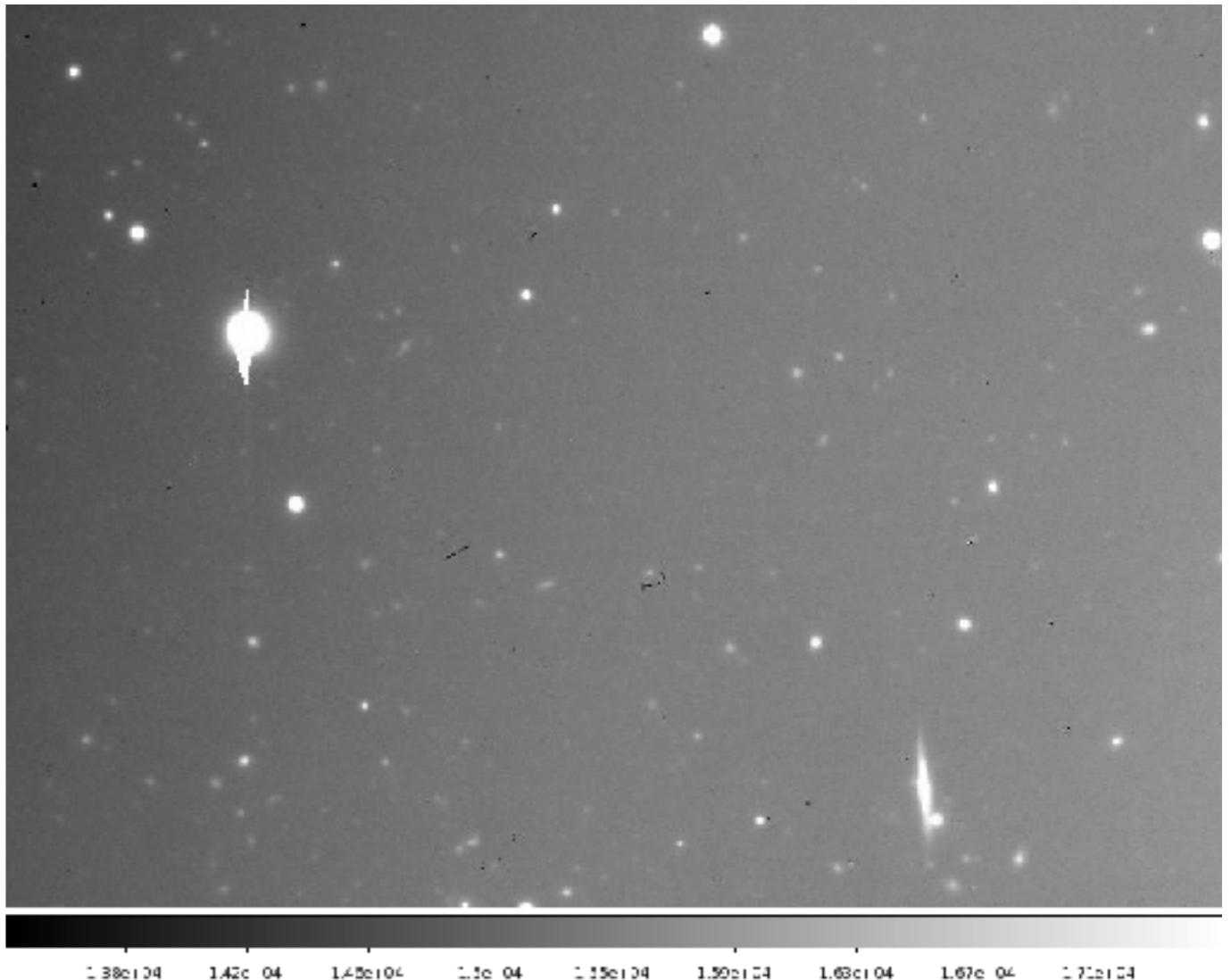


L. Hatch

Types of flat fields

night-sky flats: if observations of several different targets are taken in one night, can average these images into flat-fields assembled from the sky background (best to mask out detected objects)

- ✓ most similar to data
- ✓ uniform
- need “empty” fields
- need a lot of images

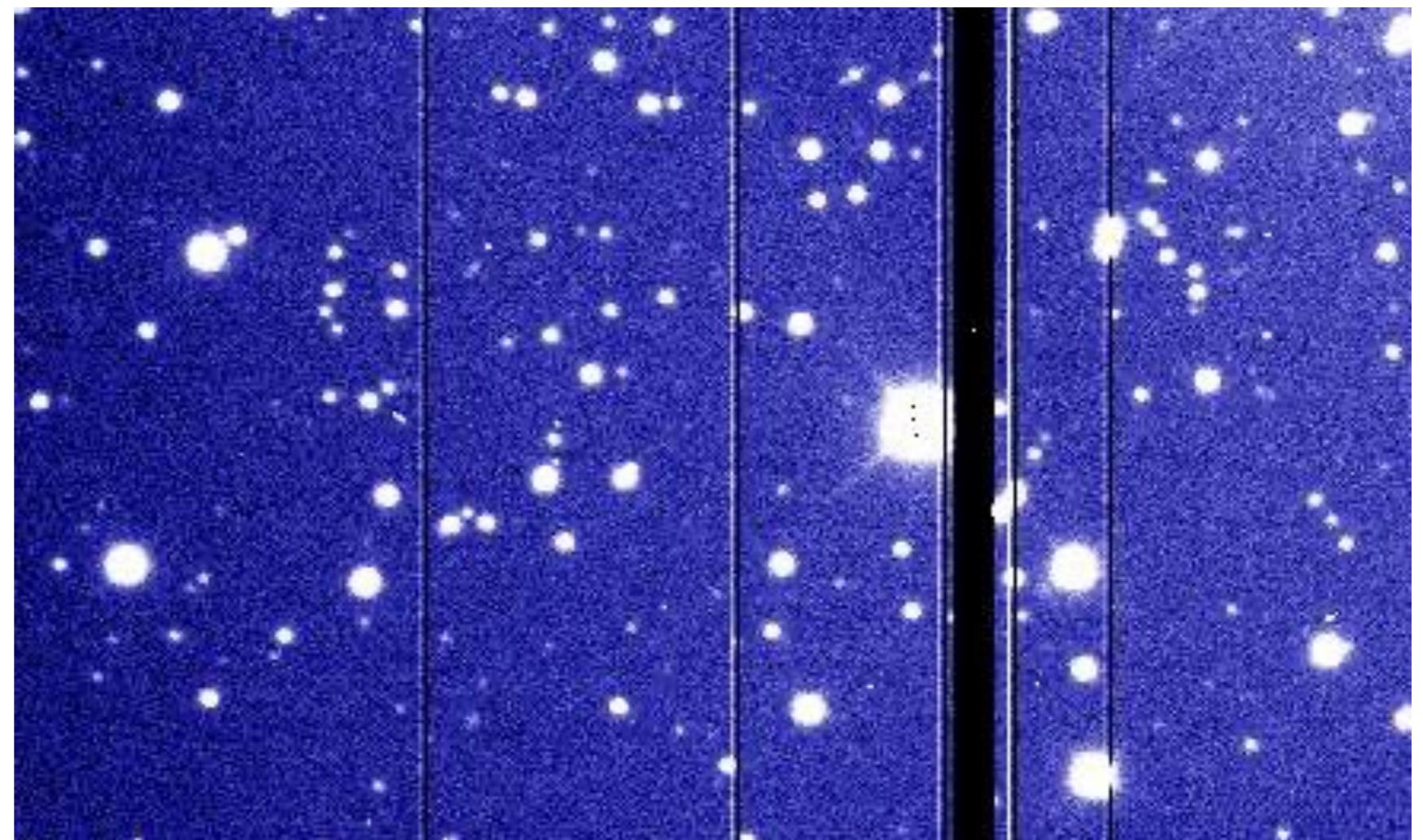


Artifacts

dead pixels / columns / rows: no (or little) response

hot pixels / columns / rows: very high noise

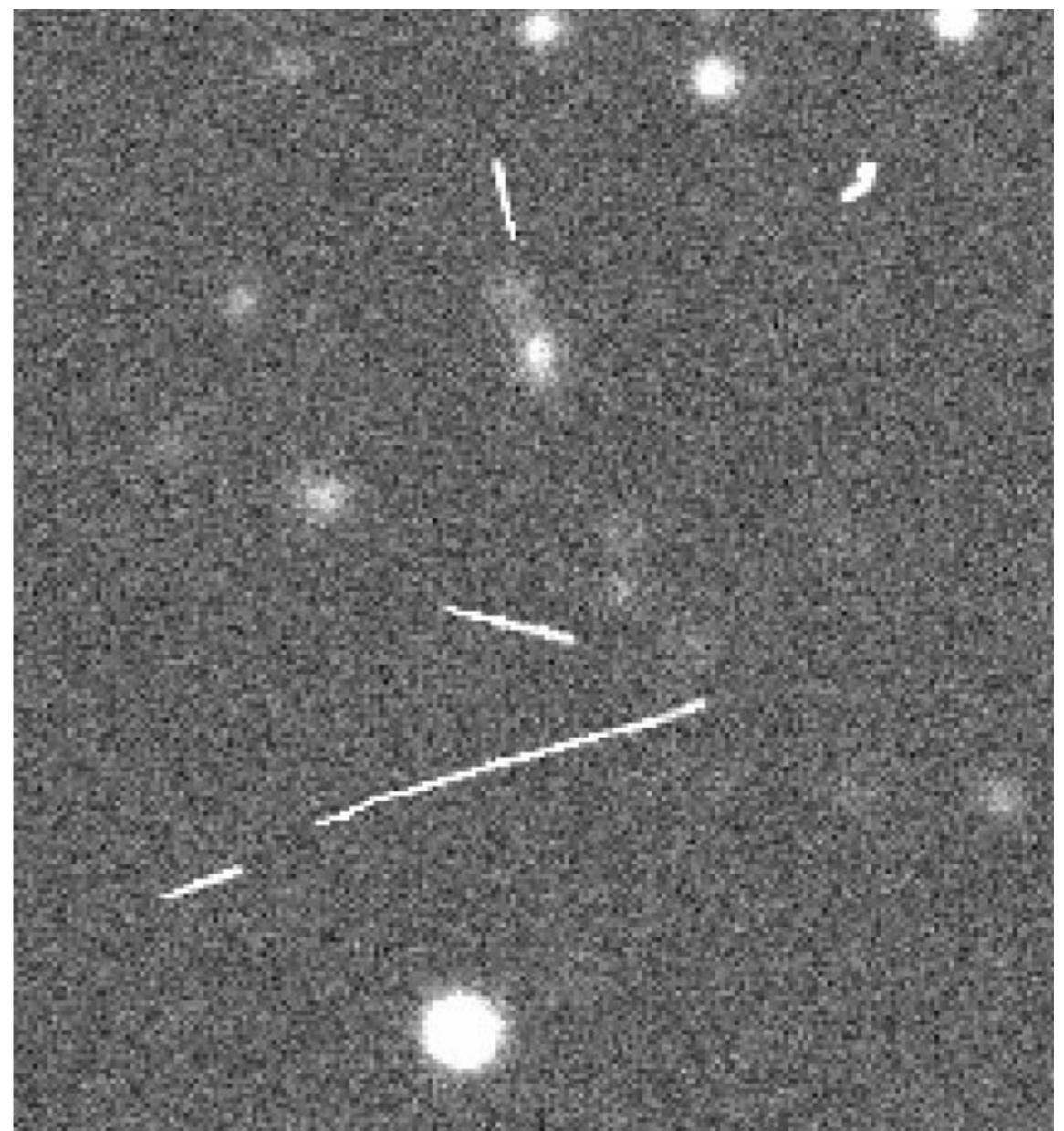
*signal is not
recoverable;
pixels need to
be masked in all
exposures*



Artifacts

cosmic rays: charged
particles hit the CCD

*need to be masked -
single exposure*

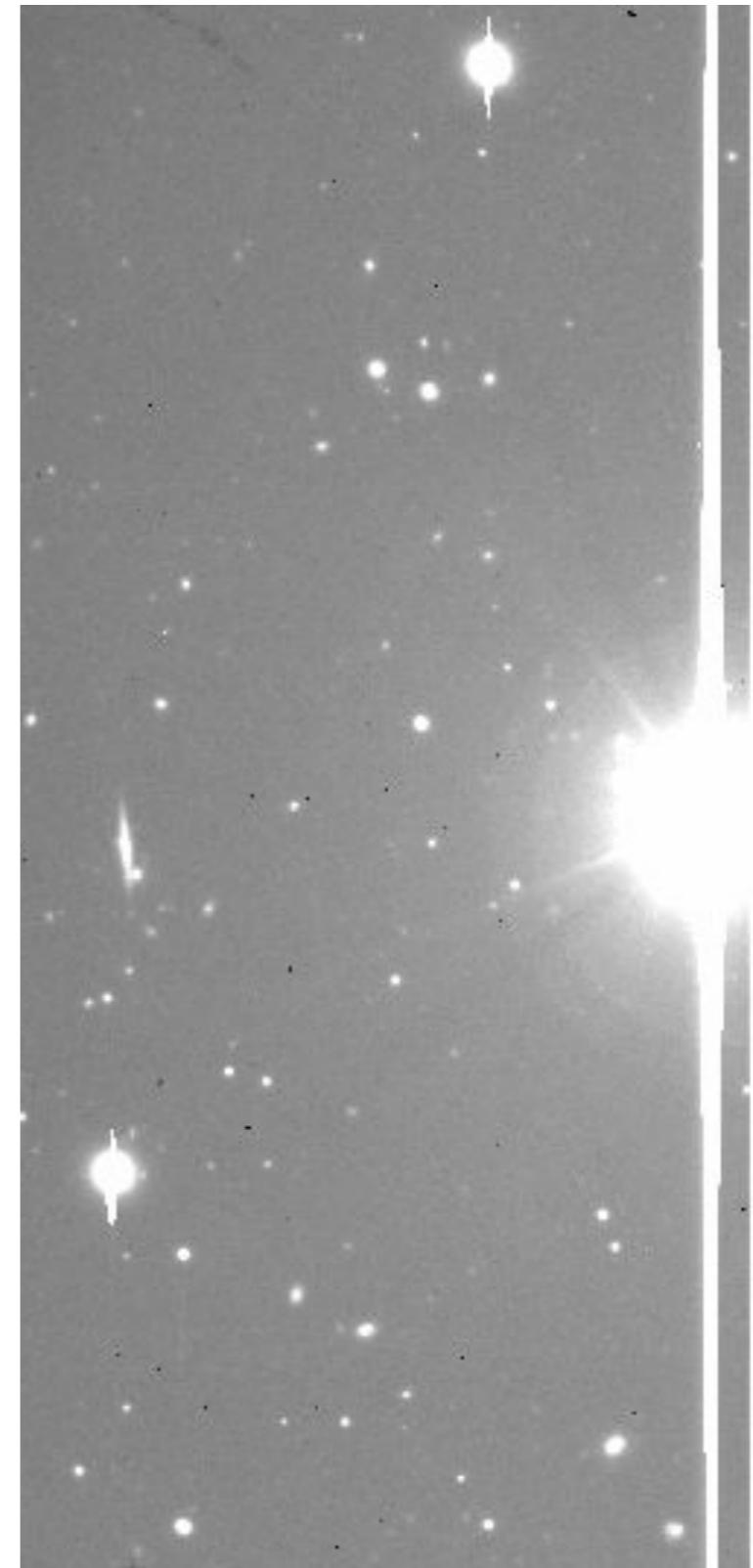


A. von der Linden

Artifacts

saturation spikes: when full well capacity is reached, electrons spill over into neighboring pixels

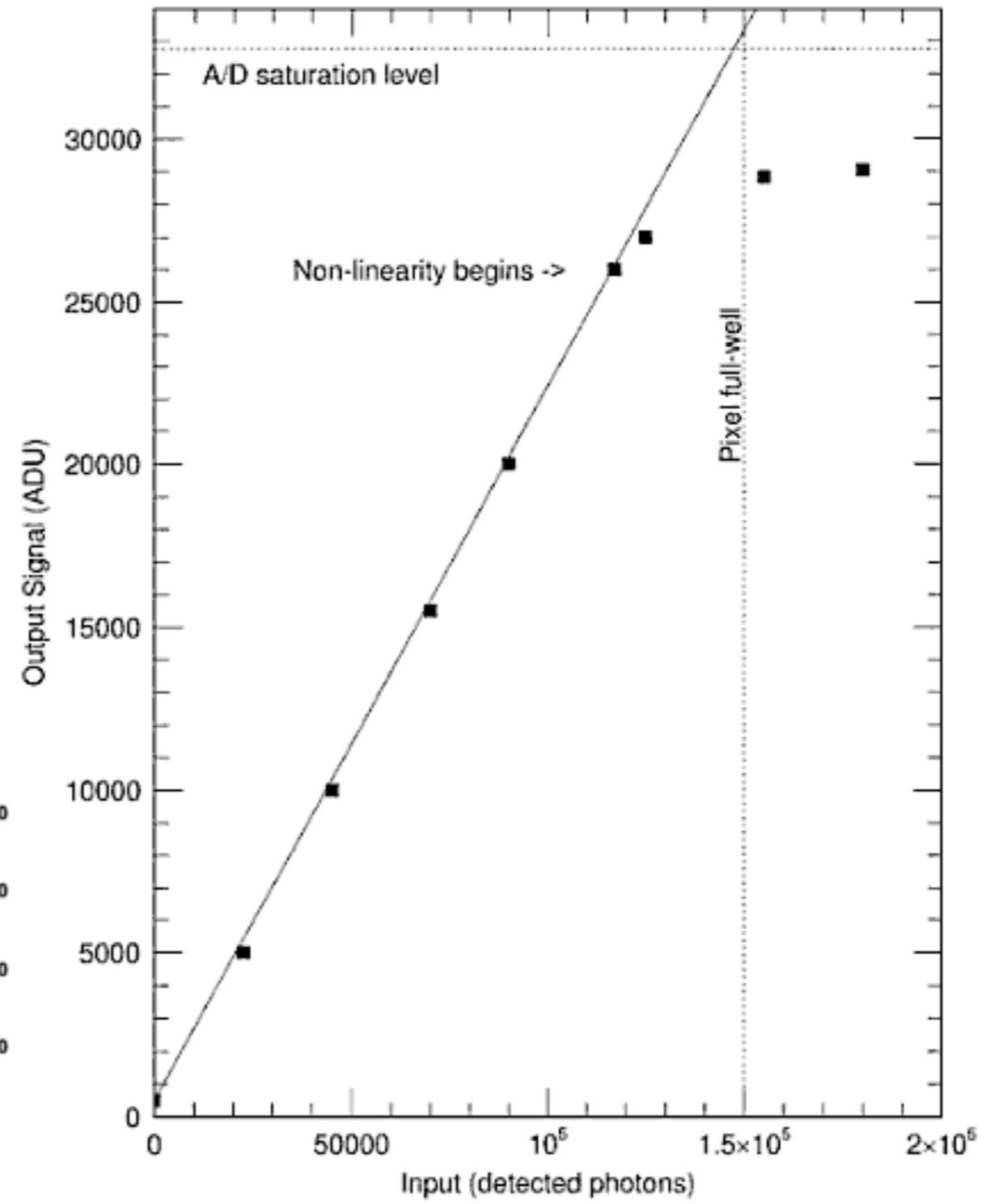
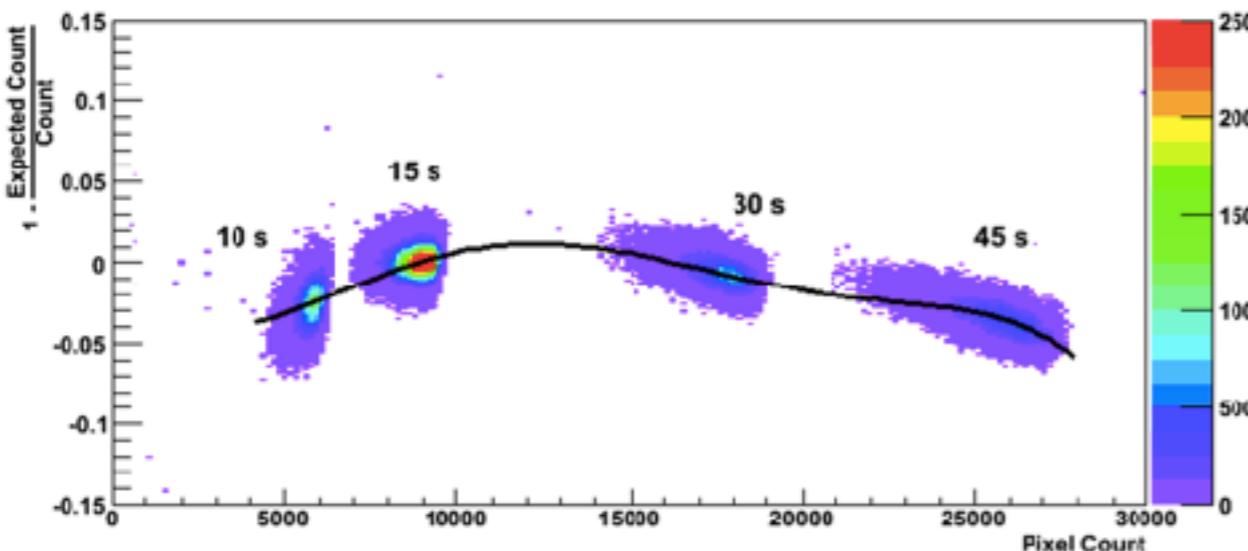
*need to be masked -
single exposure*



Artifacts

non-linearity: even before saturation level is reached, response becomes non-linear

can be measured from dome-flats



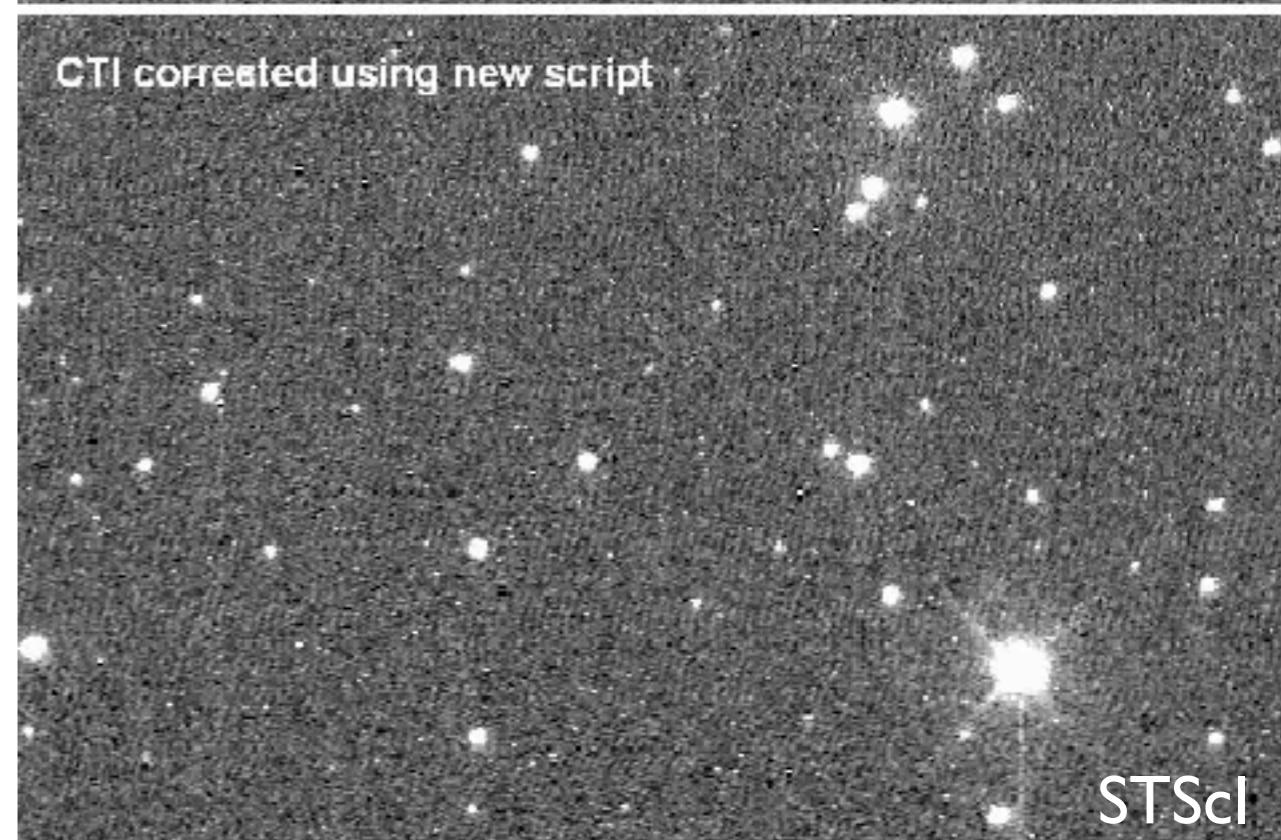
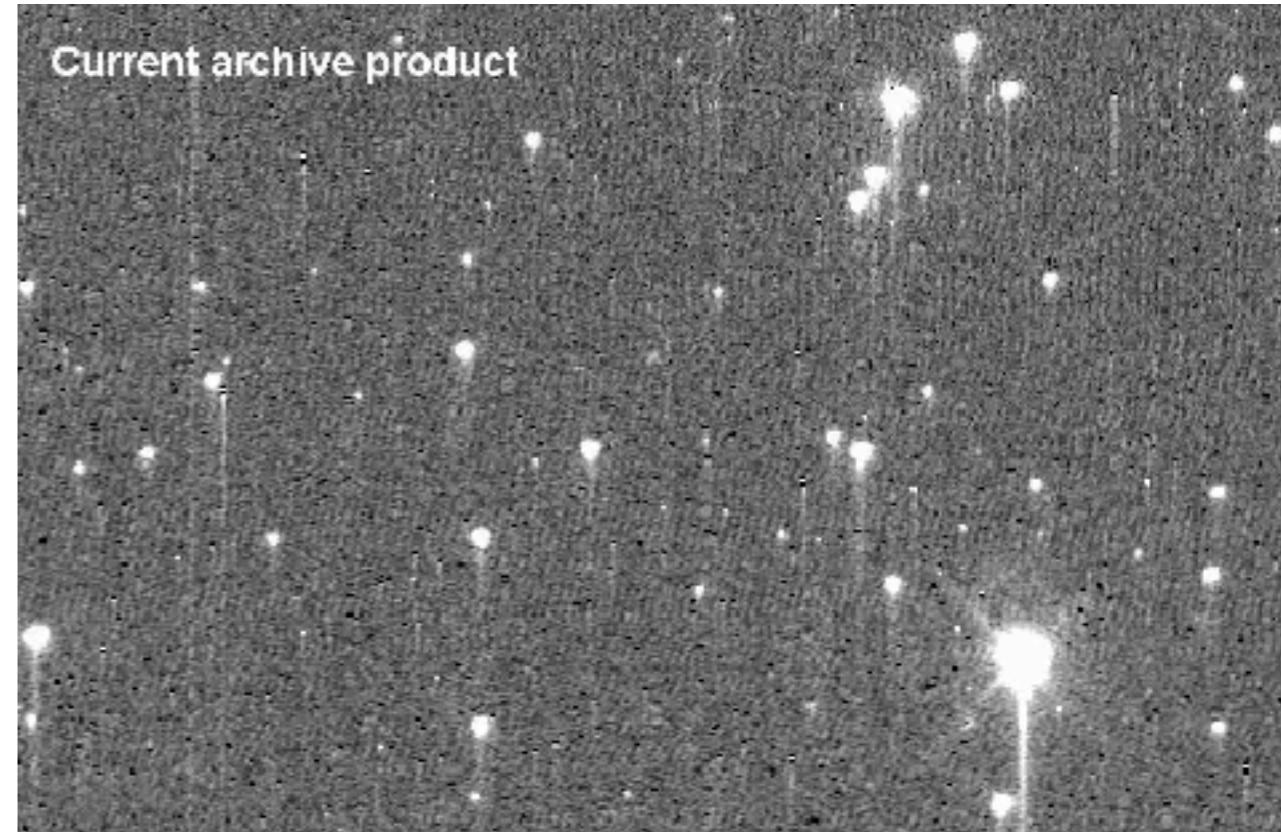
Artifacts

Charge Transfer Inefficiency (CTI): not all electrons are transferred from one pixel to the next during read-out

Charge Transfer Efficiency (CTE): fraction of photons that is transferred

CTI is a significant problem for Hubble's cameras because of radiation damage

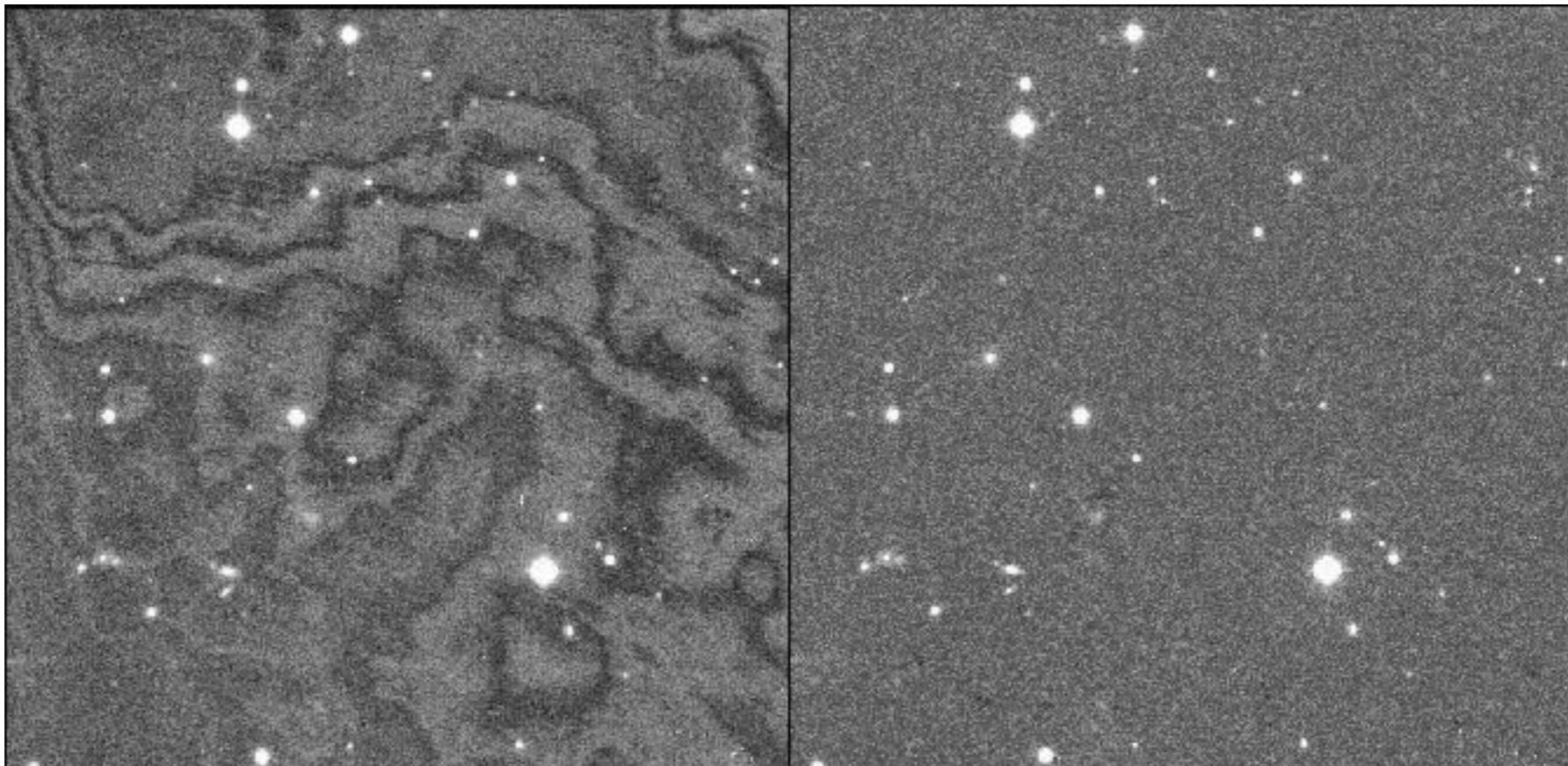
correction based on re-distributing charge



Artifacts

fringing: some light is reflected within the CCDs → leads to interference with incident light

fringing increases with wavelength, and decreases with thickness of CCDs



M. Schirmer

needs to be modeled; e.g. by subtracting a heavily smoothed image

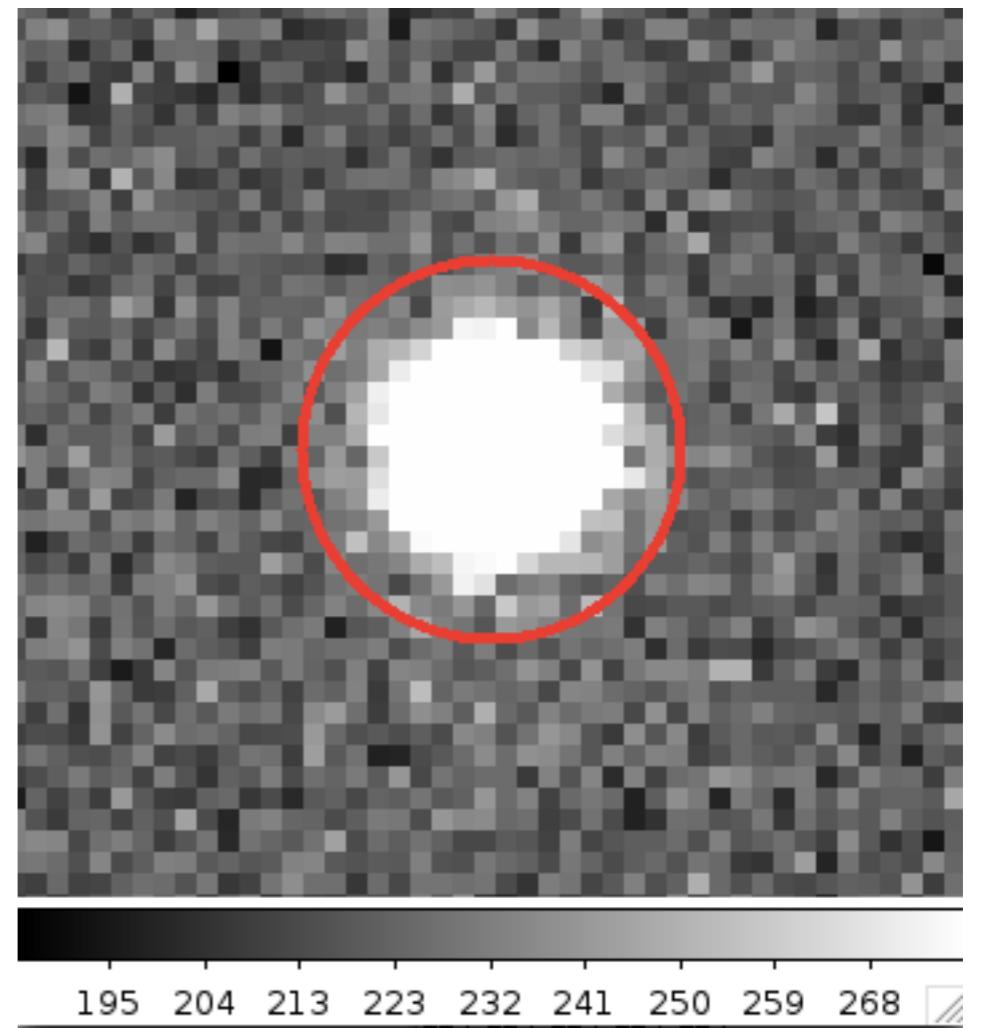
Measuring the flux of an object on a CCD image

flux measured in an aperture:

total electrons = electrons from
object + electrons from background
(sky, dark current, etc.)

signal = total electrons -
background electrons

$$N_{\text{object}} = N_{\text{total}} - N_{\text{background}}$$



*note: we cannot distinguish “object electrons” from “background electrons”,
so $N_{\text{background}}$ is the expected number of background electrons *within the aperture*

FITS files

So you took all those images, now what?

Images

FITS: Flexible Image Transport System

- open standard for astronomical images
- (at least) two parts:
 - image (binary format, integer or float)
 - ASCII header
- can have multiple extensions (images)
- For large data, more modern data formats are available, i.e. HDF5 format (Hierarchical Data Format)

Images

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 - For large data, more modern data formats are available, i.e. HDF5 format (Hierarchical Data Format)
- No data without meta data!

Header Keywords

Mandatory Structure:

Table 5.1: Mandatory
keywords for primary header.

- 1 `SIMPLE`
- 2 `BITPIX`
- 3 `NAXIS`
- 4 `NAXISn, n = 1, ..., NAXIS`

(other keywords)

last `END`

Conforms to standard:
`T(rue) / F(alse)`

Bits per pixel:
16: integer
32: float

Number of axes:
2d image: `NAXIS=2`

Image dimensions

End of header

Example

Images from our CCD camera:

```
====> file m13.00000077.FIT (main) <====  
SIMPLE = T/CCDSOFT-SOFTWARE BISQUE 3  
BITPIX = 16  
NAXIS = 2  
NAXIS1 = 1024  
NAXIS2 = 1024  
BSCALE = +1.00000000000E+000  
BZERO = +3.27680000000E+004  
BIAS = 100  
FOCALLEN= +3.55600000000E+003  
OPTDREF = +0.00000000000E+000
```

How big is the image (pixels by pixels)?

Example

Images from our CCD camera:

```
HPTHREH = +0.00000000000E+000
APTDIA = +3.560000000000E+002
TELESCOP= 'Meade LX200'
UBSERVER= 'T. Cohen, B. Schultz, X. Liu, B. Baserdem'
DATE-OBS= '2016-08-30T03:11:28.477'
TIME-OBS= '03:11:28.477'
SWCREATE= 'CCDSoft Version 5.00.210'
SET-TEMP= -5.00000000000E+000
COLORCCD= 0
DISPCOLR= 1
IMAGETYP= 'Light Frame'
CCDFPFT = 1

UBSERVER= SBIGLEXI version 1.0
FILTER = 'Visual'
EXPTIME = +1.00000000000E+001
EXPOSURE= +1.00000000000E+001
LW-SPLIT= 200
CCD-TEMP= -5.232156845990E+000
TEMPERAT= -5.232156845990E+000
INSTRUME= 'SBIG STL-1001 3 CCD Camera'
EGAIN = +2.060000000000E+000
F-GAIN = +2.060000000000F+000
ICK = 342
TE = 447
```

Specifying coordinates

The astrometric information in FITS images (also referred to as the WCS) is stored in the header using a standard set of keywords. The reference location is defined by the following keywords:

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- CRVAL2: defines the declination (δ) of the reference pixel
- CRPIX1: the x location of the reference pixel
- CRPIX2: the y location of the reference pixel

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- CRPIX1: the x location of the reference pixel
- CRPIX2: the y location of the reference pixel

The plate scale and rotation of the image is contained in the CD MATRIX (CD?_? keywords).

- CD1_1 is the partial of first axis coordinate w.r.t. x
- CD1_2 is the partial of first axis coordinate w.r.t. y
- CD2_1 is the partial of second axis coordinate w.r.t. x
- CD2_2 is the partial of second axis coordinate w.r.t. y

$$\begin{pmatrix} CD1_1 & CD1_2 \\ CD2_1 & CD2_2 \end{pmatrix} = scale * \begin{pmatrix} \cos(\theta) & \sin(\theta) \\ -\sin(\theta) & \cos(\theta) \end{pmatrix}$$

Specifying coordinates

$$\begin{pmatrix} CD1_1 & CD1_2 \\ CD2_1 & CD2_2 \end{pmatrix} = scale * \begin{pmatrix} \cos(\theta) & \sin(\theta) \\ -\sin(\theta) & \cos(\theta) \end{pmatrix}$$

Thus, to go from image coordinates (x,y) to sky coordinates (α, δ) :

$$\begin{pmatrix} \alpha - CRVAL1 \\ \delta - CRVAL2 \end{pmatrix} = \begin{pmatrix} CD1_1 & CD1_2 \\ CD2_1 & CD2_2 \end{pmatrix} \begin{pmatrix} x - CRPIX1 \\ y - CRPIX2 \end{pmatrix}$$

Specifying coordinates

After astrometric calibration:

```
CTYPE1  = 'RA---TAN-SIP' / TAN (gnomic) projection + SIP distortions
CTYPE2  = 'DEC--TAN-SIP' / TAN (gnomic) projection + SIP distortions
EQUINOX =           2000.0 / Equatorial coordinates definition (yr)
LONPOLE =           180.0 / no comment
LATPOLE =            0.0 / no comment
CRVAL1  =      250.418630769 / RA of reference point
CRVAL2  =      36.5118440685 / DEC of reference point
CRPIX1  =      351.470682144 / X reference pixel
CRPIX2  =      386.277894974 / Y reference pixel
CUNIT1  = 'deg'      / X pixel scale units
CUNIT2  = 'deg'      / Y pixel scale units
CD1_1   = -3.33986320359E-05 / Transformation matrix
CD1_2   =  0.000411933007076 / no comment
CD2_1   = -0.000411849476697 / no comment
CD2_2   = -3.33825508905E-05 / no comment
```

Our camera does not know where the telescope is pointing
- astrometric calibration is important e.g. for exoplanet lab

Viewing FITS images

best done with specialized software

e.g. ds9 (by
Smithsonian
Observatory)

<http://ds9.si.edu>

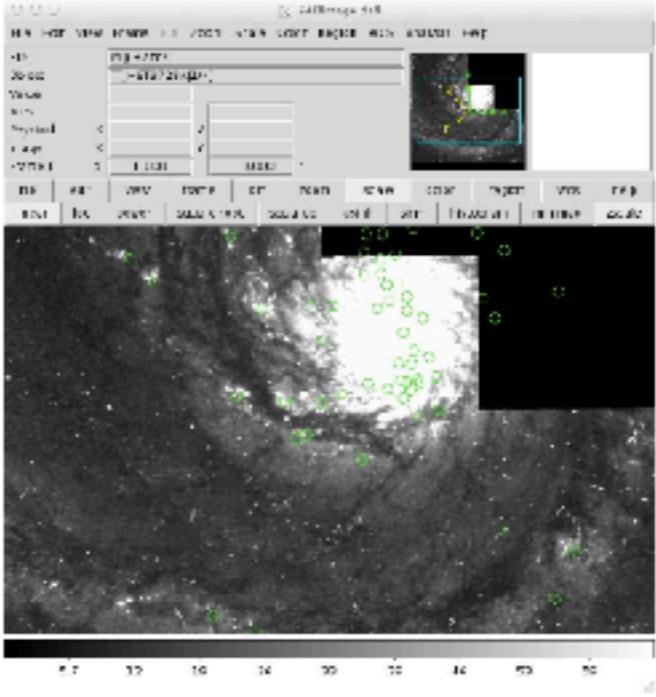
SAOImage DS9

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SAOImage DS9 Version 7.4

DS9 version 7.4 is now available on the [Download](#) page. New to version 7.4 is image blocking and reordering of data cube axes. Please see the [What's New](#) page for more details. News Flash-- Version 7.5b4 is now available.



The screenshot shows the DS9 application window. It features a main panel displaying a grayscale astronomical image with several green circular regions overlaid, representing selected objects or regions of interest. To the left of the main panel is a control panel with various buttons and sliders, and at the bottom are coordinate scales ranging from 10 to 100. The top of the window has a menu bar and several tabs.

SAOImage DS9 development has been made possible by funding from the Chandra X-ray Science Center (CXC) and the High Energy Astrophysics Science Archive Center (HEASARC). Additional funding was provided by the JWST Mission office at Space Telescope Science Institute to improve capabilities for 3-D data visualization.

Tweets by @SAOImageDS9

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@SAOImageDS9

SAOImage DS9 version 7.5b4 is now available for download at ds9.si.edu/site/Beta.html

  15 JUL

 SAOImage DS9
@SAOImageDS9

SAOImage DS9 version 7.5b3 is now available for download at ds9.si.edu/site/Beta.html. New support for Simple Image Annotate protocol

  14 JUL

 SAOImage DS9 Retweeted

 Eric Mandel
@astrosoftware

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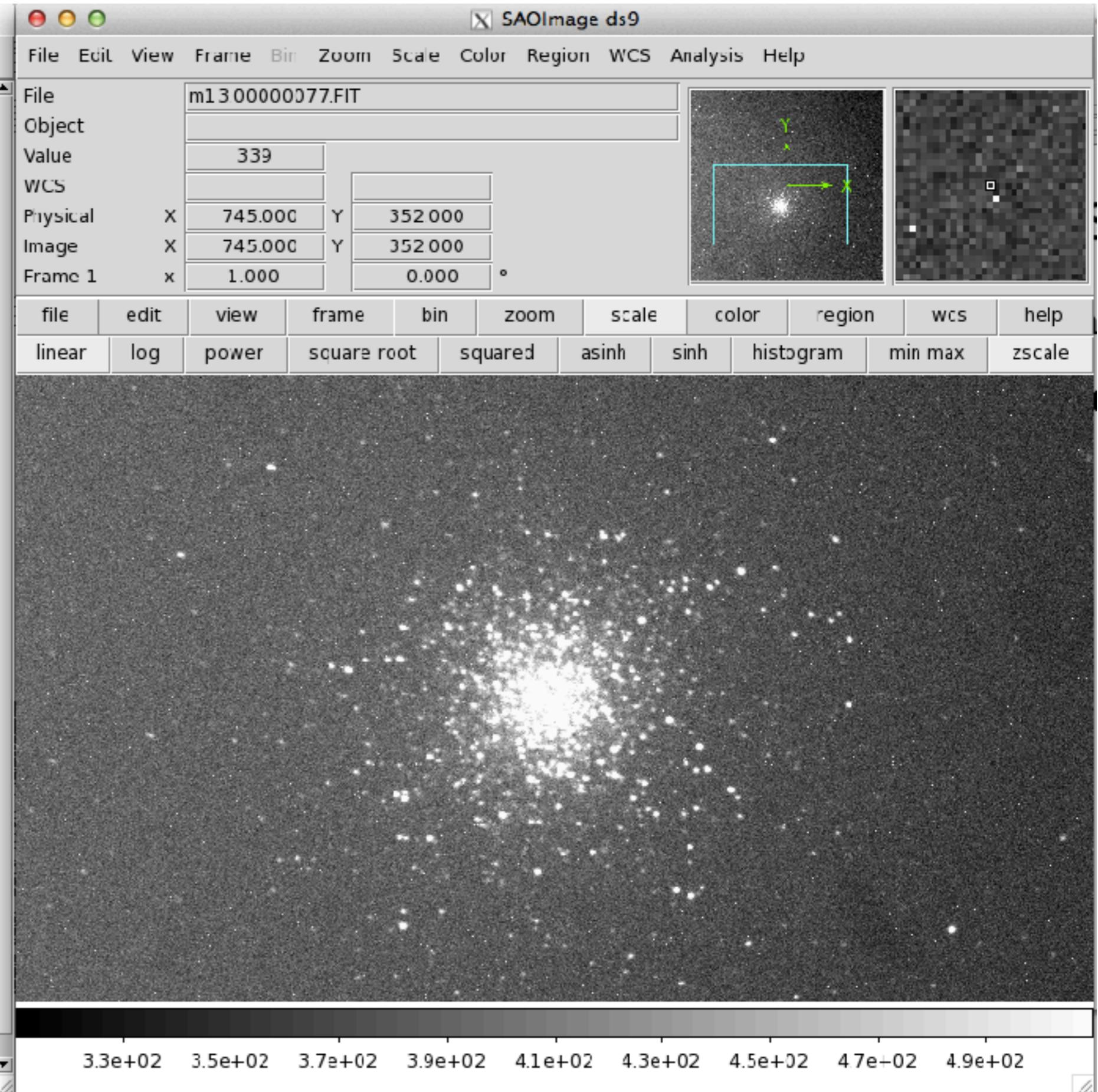


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m13.00000077.FIT

```
SIMPLE = T/CCDSOFT-SOFT
BITPIX = 16
NAXIS = 2
NAXIS1 = 1024
NAXIS2 = 1024
BSCALE = +1.000000000000E+000
BZERO = +3.2/68000000000E+004
BIAS = 100
FOCALLEN = +3.556000000000E+003
APTAREA = +0.000000000000E+000
APTTDA = +3.560000000000F+002
TELESCOP = Meade LX200
OBSERVER = T. Cohen, B. Schultz, X. Liu, B.
DATE-OBS = 2016-08-30T03:11:28.477
TIME-OBS = 03:11:28.477
SWCREATE = CCDSOFT Version 5.00.210
SET-TEMP = -5.000000000000E+000
COLORCCD = 0
DISPCOLR = 1
IMAGE-TYP = Light Frame
CCDSFPT = 1
XORGSUBF = 0
YORGSUBF = 0
CCDSJBFL = 0
CCDSJBFT = 0
XBINNING = 1
CCDXBIN = 1
YBINNING = 1
CCDYBIN = 1
EXPSTATE = 293
CCD-TEMP = -5.232156845990E+000
TEMPERAT = -5.232156845990E+000
INS-TRUME = 'SBIG STL-1001 3 CCD Camera'
EGAIN = +2.060000000000E+000
E-GAIN = +2.060000000000E+000
XPIXSZ = +2.400000000000E+001
YPTXSZ = +2.400000000000F+001
SBIGIMG = 18
USER_2 = 'SBIG STL-1001 3 CCD Camera'
DATA-MAX = 65535
SBSTDVER = SBFITSEXT Version 1.0
FILTER = Visual
EXPTIME = +1.000000000000E+001
EXPOSURE = +1.000000000000E+001
CBLACK = 342
CWHITE = 447
END
```



Viewing FITS headers

- ds9 (File -> Display Header)
- python (see tutorial), R, C, matlab, ...
- command-line tools: dfits and fitsort

```
[anja@ki-ls08 test_data]$ dfits 00000001.BIAS.FIT | more
====> file 00000001.BIAS.FIT (main) <====
SIMPLE = T/CCDSOFT-SOFTWARE BISQUE 3
BITPIX = 16
NAXIS = 2
NAXIS1 = 1024
NAXIS2 = 1024
PCRSIZE = +1.00000000000E+000
```

```
[anja@ki-ls08 test_data]$ dfits *.DARK.FIT | fitsort EXPTIME CCD-TEMP
FILE          EXPTIME          CCD-TEMP
00000011.DARK.FIT +1.00000000000E+001 -5.232156845990E+000
00000012.DARK.FIT +2.00000000000E+001 -5.232156845990E+000
00000013.DARK.FIT +4.00000000000E+001 -4.817803680962E+000
00000014.DARK.FIT +8.00000000000E+001 -4.817803680962E+000
00000015.DARK.FIT +1.00000000000E+002 -4.917902880962E+000
```

FITS image manipulation / math

- python: FITS file handling part of astropy (see tutorial)
- R: FITSio package
- matlab: fitsread, etc.
- C: cfitsio library

command line:

- FTOOLS, e.g.:

```
ftpixcalc out.fits "(a-b)" a=img1.fits b=img2.fits
```

Office Hours

- during class (seriously!)
- easiest way to get in touch with me: slack
- office hours:
 - Prof.: Fr 2:30-3:30pm, ESS 453
 - Bela: Th 5-6 pm, ESS 352 (downstairs)
 - Paras: Tu 5-6 pm, ESS 352 (downstairs)
- by appointment

HW1 - Plagiarism

3. Read the wiki page on Grading³ and the information in the links on plagiarism. Answer the following:

Please name
your file THIS.

- (a) (1 pt) How should you name the pdf file that you submit for this homework?
(b) (1 pt) You submitted your homework on time, but you notice an error before the deadline. What should you do?

- i. Re-submit the entire homework with the error fixed, and delete the first submission.
ii. Submit a second pdf file with just the corrected part.

- (c) (2 pts) Which of these are examples of plagiarism? (More than one answer may be correct.)

yes i. Copying your lab-mate's introduction section of a lab report.

yes ii. Taking somebody else's lab report, slightly modifying each sentence / paragraph, and submitting it as your own.

yes iii. Copying your buddy's telescope proposal for a Keck telescope, and submitting it as your own.

yes iv. Stating a "fact" from wikipedia without citing the original source.

no v. Using ChatGPT to answer a homework question, following the links that ChatGPT provides to check for accuracy, and citing ChatGPT and the links as sources.

- (d) (2 pts) What happens when you get a "Q" grade? (Answer yes/no/maybe.)

maybe i. Immediate expulsion from school.

yes ii. You lose your scholarship.

maybe iii. You receive an "F" for the course grade.

yes iv. You have to take the "Q" course.

- no** (e) (1 pt) In this class, is the use of ChatGPT automatically considered plagiarism?

HW1 - Significant digits

Code output with way
too many digits:

$$99.123456789 \\ \pm 0.004556789$$

Round the uncertainty
to one (or two) digits:

$$0.00455679 \rightarrow 0.005$$

The location of this
digit tells you the
location of the last
significant digit:

$$99.123 \\ \pm 0.005$$

Voila:

$$99.123 \pm 0.005$$

We will take points off in your homeworks / lab reports if you keep getting this wrong.

StarAlt

you have to pay attention to the format of your coordinates!

The screenshot shows the StarAlt software interface. Under the 'Mode' section, 'Staralt' is selected. In the 'Night' section, the date is set to 06 September 2017. The 'Observatory' section contains a dropdown menu with 'Roque de los Muchachos Observatory (La Palma, Spain)' selected, and a text input field for custom coordinates. A red circle highlights the text input field and the dropdown menu. Below the input field, instructions and an example coordinate string are visible.

Mode: Staralt

Night: 06 September 2017 or date when the local night starts. Staralt,
Startrack only.

Observatory: Roque de los Muchachos Observatory (La Palma, Spain)

Select one above or specify your own site with this format:
Longitude(°East) Latitude(°) Altitude(metres) UTC offset
(e.g., 289.2767 -30.2283 2725 -4)
Ex.: 289.2767 -30.2283 2725 -4

How are Mt. Stony Brook's coordinates correctly specified?

- A) 40.9 73.1
- B) 73.1 40.9
- C) -40.9 73.1
- D) 286.9 40.9

Coordinates: 40.914224°N 73.11623°W

[Stony Brook University](#)



CCD Lab, part 1

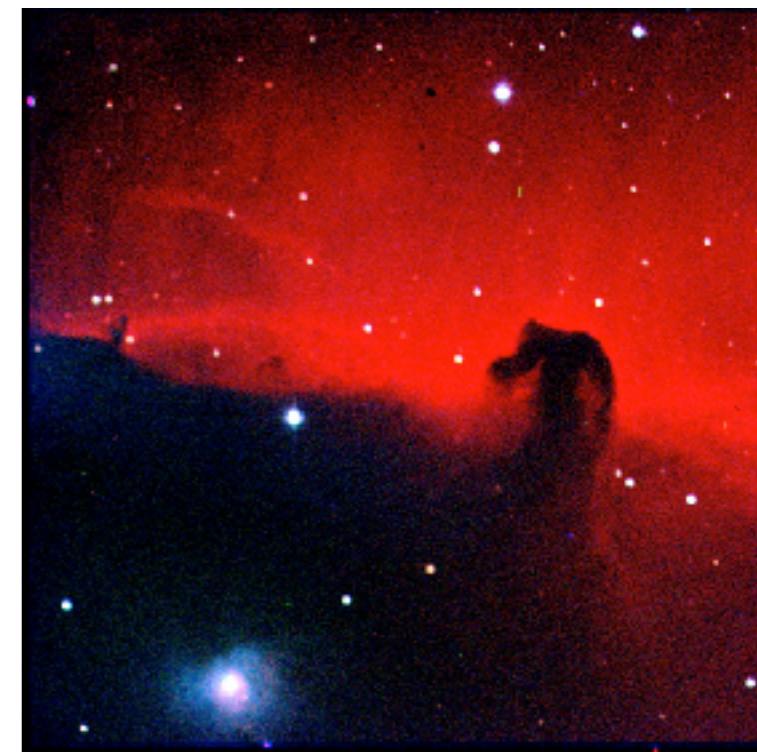
- If you have not scheduled the Daytime part of Lab I, do so TODAY !
- You need to read the lab manual *before* you do the Lab. You will be quizzed at the beginning of the lab. If you are unprepared, the lab will be canceled, you will get points taken off the final lab grade and you have to find a new date!

CCD Lab, part 2

Request observing time for the Lab 1 “pretty picture”

- think of some objects you would like to image
- look up their coordinates (e.g. Simbad, wikipedia)
- look up their size and magnitude
- make a StarAlt plot to verify that the object is well observable

- message / e-mail the TAs + instructor;
**include a justification of your request
(StarAlt plot, size, brightness, choice of
filters [BVRI, Ha]) + finder charts**
- schedule 3 nights (weather back-up)
 - first date can be same night as part 1
 - other nights: can schedule 2 groups on the same night



SBU Astro Club

Today's tutorials

github.com/anjavdl/PHY517_AST443/wiki/Schedule-Fall-2025 90%

anjavdl / PHY517_AST443 Q Type / to search

Code Issues 5 Pull requests Discussions Actions Projects Wiki Security Insights Settings

Schedule Fall 2025

anjavdl edited this page 19 hours ago · [19 revisions](#) Edit New page

Date	Topics	Slides	Tutorials	Homework
Aug 25	Intro, Coordinate Systems	Lecture 0 , Lecture 1		HW1, due Aug 27
Aug 27	Time, Magnitudes, Atmosphere, Telescopes	Lecture 2	Tu1: Linux etc.	HW2, due Sep 3
Sep 1	<i>Labor Day - no class</i>			
Sep 3	CCDs, FITS files	Lecture 3	Python1 , Python2 , Tu4: Astro Software	HW3, due Sep 10
Sep 8	Spectroscopy	Lecture 4	Spectroscopy	
Sep 10	Statistics 1	Lecture 5		HW4, due TBD
Sep 15	Statistics 2	Lecture 6	Tu5: Source Extractor	HW5, due TBD
Sep 17	Data Analysis Help Session			

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General Information

- [Syllabus](#)
- [Schedule w/ links to slides, HW, etc.](#)
- [Grading](#)
- [Academic Policies](#)

Labs and Write-Ups

- [Lab report guidelines](#)
- [Observing Equipment](#)
- [Observing Calendar](#)
- [Lab 1: CCDs](#)
- [Lab 2a: Exoplanet transit](#)
- [Lab 2b: Spectroscopy](#)
- [Lab 3: Your own proposal](#)
- [Discontinued: Radio Interferometry](#)
- [Astronomical Data Archives](#)
- [Weather](#)
- [End-of-night report](#)

Python Tutorials

← → ⌂ 🔒 github.com/anjavdi/PHY517_AST443/wiki/Python



There are a number of ways of working with python, in particular:

1. interactively on the command line (shell mode)
2. with python programs / scripts
3. through jupyter notebooks
4. through [Google Colab](#) notebooks

Shell mode

In shell mode, you simply type the command `python` or `python3` into a terminal, which will print some details about the version of python you have installed, the date, and the commands for how to get help, credits, and licensing information. The terminal will show `>>>`, which means you can now type in python commands and the interpreter will execute those commands. Note that on the Computing Lab machines, `python` invokes python2.7, so you need to call `python3` to get python3.

Python programs / script

The second way to use python is in script mode. You write a text file containing all of the python commands you want python to execute, in the order that you want them done. After you save this file, which is called a script, you type `python` into a terminal with your script filename as the first argument, and the python interpreter reads the script and executes it line by line. An example is the [rdj2aa.py](#) script that you can use to convert a list of RA, Dec, JD to azimuth, altitude, and UT date. In this case it takes two additional filenames for the input and output files:

```
python rdj2aa.py in.txt out.txt
```

Jupyter notebooks

[Jupyter notebooks](#) are a great way to keep code organized and documented. Jupyter can be used with several kernels, including python. Please see [here](#) for further instructions specific to this class.

Labs and Write-Ups

- [Guidelines](#)
- [How to write a decent lab report](#)
- [Observing Equipment](#)
- [Observing Calendar](#)
- [Lab 1: CCDs](#)
- [Lab 2: Exoplanet transit](#)
- [Lab 3: Diffuse Nebula Spectroscopy](#)
- [Lab 4: Your own proposal](#)
- [Discontinued: Radio Interferometry](#)
- [Weather](#)
- [End-of-night report](#)

Computing

- [Computing Resources](#)
- [Astro Software Overview](#)
- [Bash](#)
- [awk and sed](#)
- [LaTeX](#)
- [Python](#)
 • [Jupyter](#)
- [GitHub](#)
- [ds9](#)
- [SExtractor](#)
- [Topcat](#)
- [Astrometry.net](#)
- [dfits and fitsort](#)
- [Image arithmetic \(+ftools\)](#)

Python Tutorials

and/or github, and thus to work collaboratively on code. Our experience shows that if you need a particular python package for your project, it is much easier to ``install'' it on Google Colab than your own computer or the Computing Lab.

Python tutorials for this class

General python tutorial

Data file for python tutorial: [test_data.txt](#)

[Python notebook](#) on reading FITS files, numpy, plotting histograms.

FITS files: [00000025.BIAS.FIT](#), [00000026.BIAS.FIT](#)

Older tutorials in python 2.7: [Python primer](#), [notebook](#)

Installing python on your laptop

Python is available for all common operating systems. The easiest way to install it is through [anaconda](#). Anaconda includes all the packages needed for this lab, in particular numpy and astropy. Anaconda does take up significant disk space, so instead you could install miniconda along with the packages you need.

Python on the Astro Computing Cluster

By default, `python` on uhura starts `python2.7`. To get the latest `python3`, along with the latest versions of `astropy`, `numpy`, `scipy` and `matplotlib`, you should install in your own copy of `python3` through `miniconda` as follows ([video version of these instructions](#)):

1. Download Miniconda Linux 64 bit installer for linux from <https://docs.conda.io/en/latest/miniconda.html#linux-installers>.
2. Copy the Miniconda installer to your astrolab directory, e.g. `/astrolab/Fall_21/aeinstein` (replace `Fall_21/aeinstein` with the appropriate path to your data directory).
3. Run the Miniconda installer with bash, e.g.

```
/usr/bin/bash Miniconda3-py39_4.10.3-Linux-x86_64.sh
```

When prompted for the install directory YOU MUST SUPPLY YOUR astrolab directory, e.g.

```
/astrolab/Fall_21/aeinstein/conda
```

Say "yes" to the prompt about initializing Miniconda3. The Miniconda installer

Python Tutorials

tutorials are in jupyter notebook format

on your laptop:

- if you installed python through anaconda on your laptop, jupyter is included
- python is not installed on your laptop? try google colab

on the machines in the computing lab:

- follow pip install commands on wiki; OR
- install miniconda / anaconda
- if logging in remotely, follow instructions for remote set-up on jupyter wiki tab

Tutorial 4

- viewing FITS headers (dfits, fitsort, python)
- image arithmetic (python, FTOOLS)
- finding the astrometry / WCS of an image ([astrometry.net](#))
- image analysis with ds9 (Homework: photometry with ds9)