

# **Course Overview**

**ECE 5960 / 6960 Computational Photography**

**Rajesh Menon, 01/11/22**

# Project-based course

Lots of independent work with teams.

Build hardware (camera).  
Build software.

Learn by doing.



# Logistics

- Where: Zoom & *in lab, MEB 1541 (select dates)*.
- When: Tue/Thur 12:30-1:30pm MT
- Zoom: invitations sent via canvas.
- Office hours: Wednesdays 7-8pm MT (but flexible, by appt.).
- Slack: all discussions, ask questions, collaborations, Invitations to be sent via email. *[quick demo]*
- All class notes, software, online resources to be provided. No textbook required.

# Learning objectives

- Understand fundamentals of computational imaging.
- Innovate to create new types of cameras (team projects).
- Write a technical journal article & submit for peer review.
- Present your technical article.
- Create open-source software & submit to GitHub.

# Topics of interest

- Design of imaging systems.
- Design of computational post processing (linear algebra, machine learning, etc.)
- Human-centric images - how does computation help?
- Machine-centric images - how does computation help?
- What are the fundamental limits?
- Imaging in the visible and infra-red bands.
- Imaging from space.
- Biomedical imaging.
- Imaging for autonomous driving.
- Imaging for biometrics
- ... Your interests...

# Grading

- Assignments: 30%
- Team presentations: 35%
- Final technical paper (one per team & includes GitHub submission): 35%

# Course website: (link)

- All announcements will be posted here. These may not be mirrored on canvas, so please bookmark this.
- Most lectures will be recorded and posted here.
- All course material will be posted here (online content & software).
- Review schedule (tentative, small changes might happen).

# Assignments

1. [01/18] Choose team & topic
2. [01/25] Select & order image sensors, optics, relevant hardware.
3. [02/03] Complete simulation model of your system. Submit report.
4. [02/17] Submit 1st version of software tools to GitHub.
5. [03/03] Present 1st experimental results from your camera.
6. [03/17] Complete 1st draft of your technical paper.
7. [03/31] Submit 2nd version of software tools (include ML data as appropriate) to GitHub.
8. [04/14] Submit technical paper for peer review & submit final software (and all data) to Github.
9. [04/21] Final presentation of results.



# Journals for peer review

- At least at the quality of IEEE journals.
- Examples are:
  - Optics Letters
  - Optics Express
  - APL Photonics, etc.
- All of these have overleaf (Latex) & word templates. Please use them.

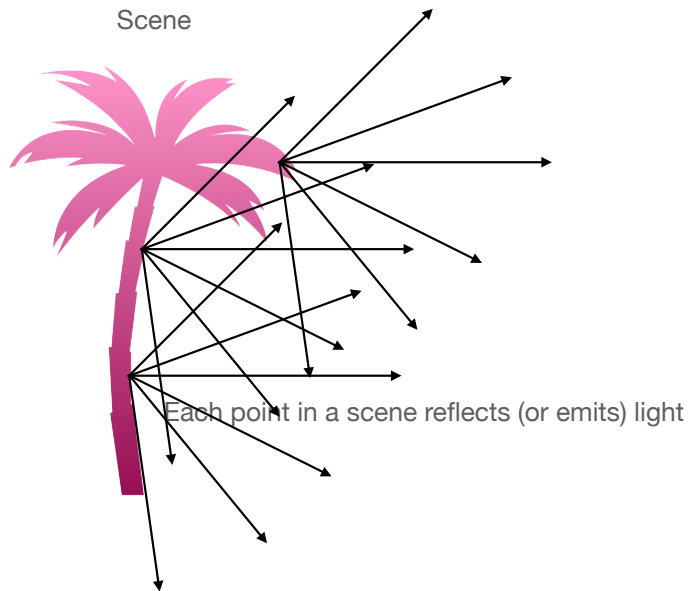
# Open source software & data availability

- All data you collect should be uploaded for free availability on GitHub.
- All software should be made open source & freely available on Github.
- Exceptions possible if you want to patent or restrict usage. *Let me know.*

# Introductions & interests

- What do you want to get out of this course?
- What are your skill sets ?
- Feel free to discuss any passion projects (if you have any).

# Why does a camera need optics?

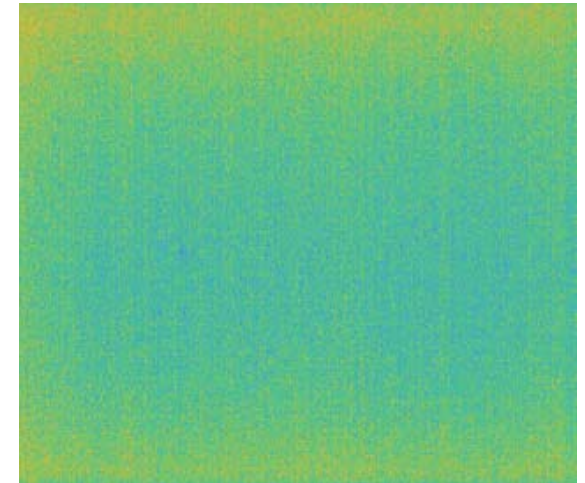


sensor



If we have no optics & just record light on a sensor, light from all points get mixed together & no image is formed!

Example of output from an image sensor with no optics



# Why does a camera need optics?

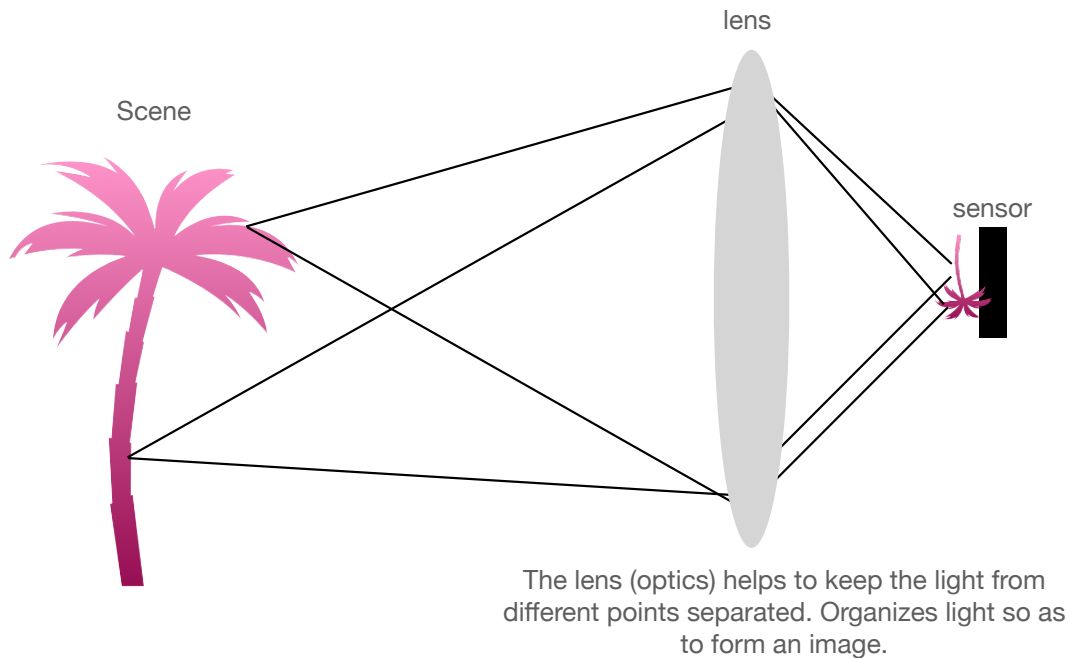


Image is a 1:1 map of the object with (de) magnification & sometimes lateral inversion.



We will learn how to model this process in a computer for relatively complex camera modules.

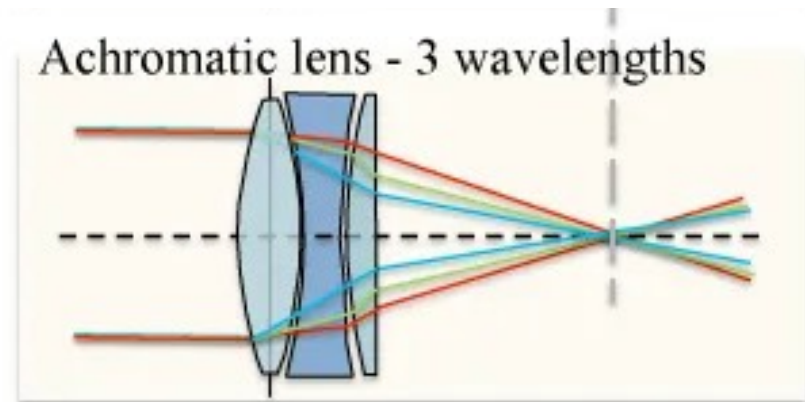
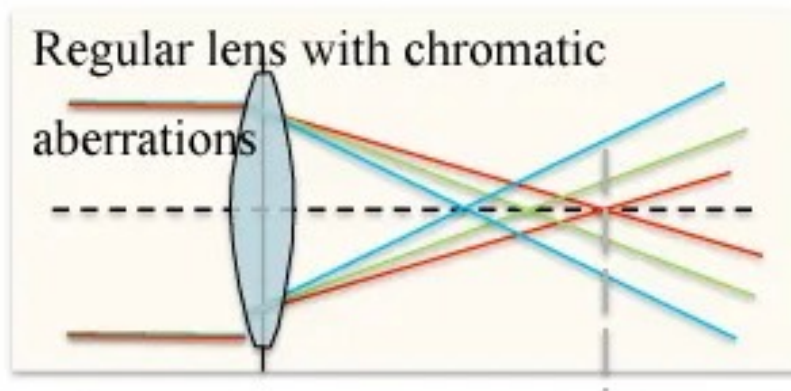


**The optics can be complicated.**



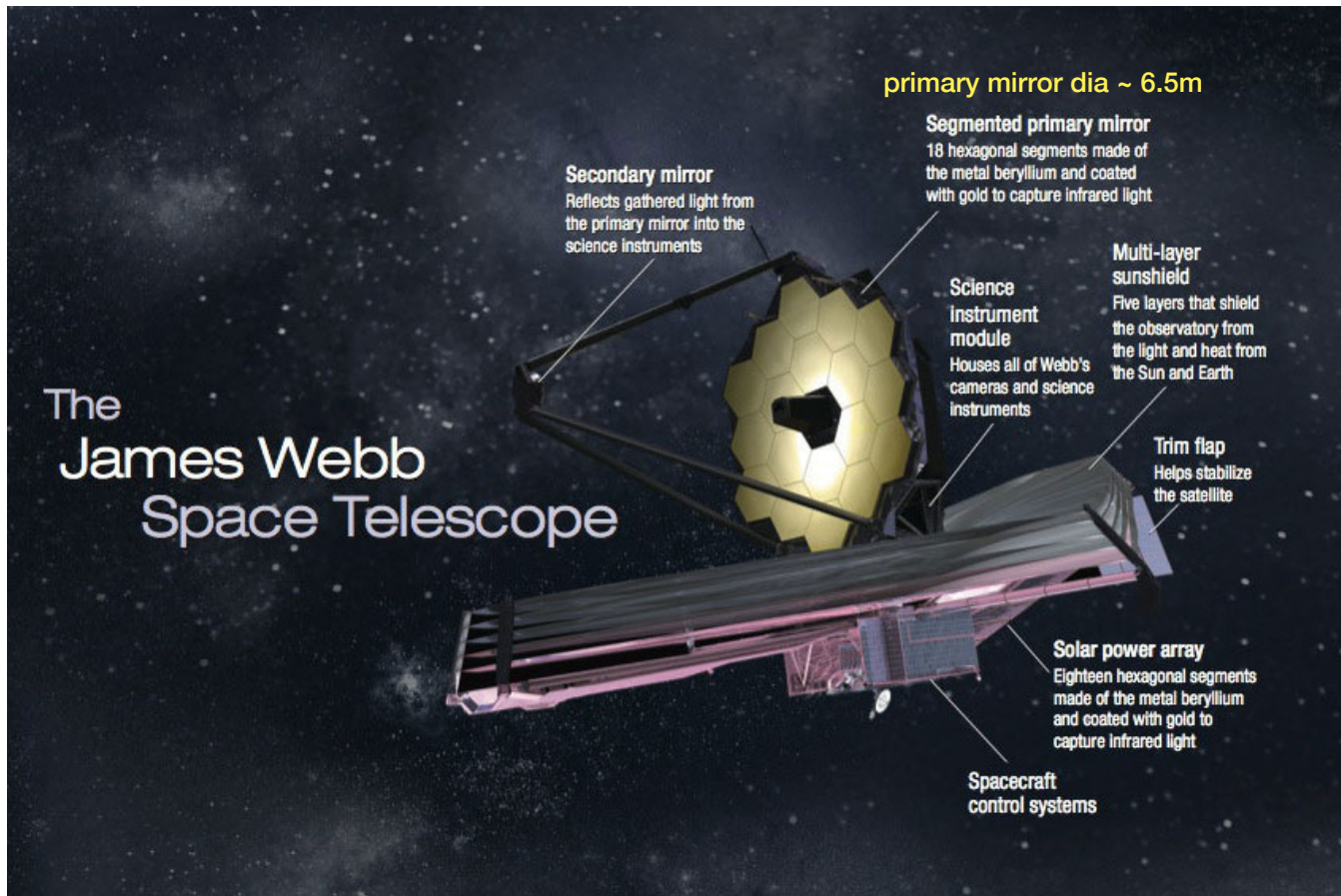
# Why do you need many lenses?

For example for correcting aberrations.



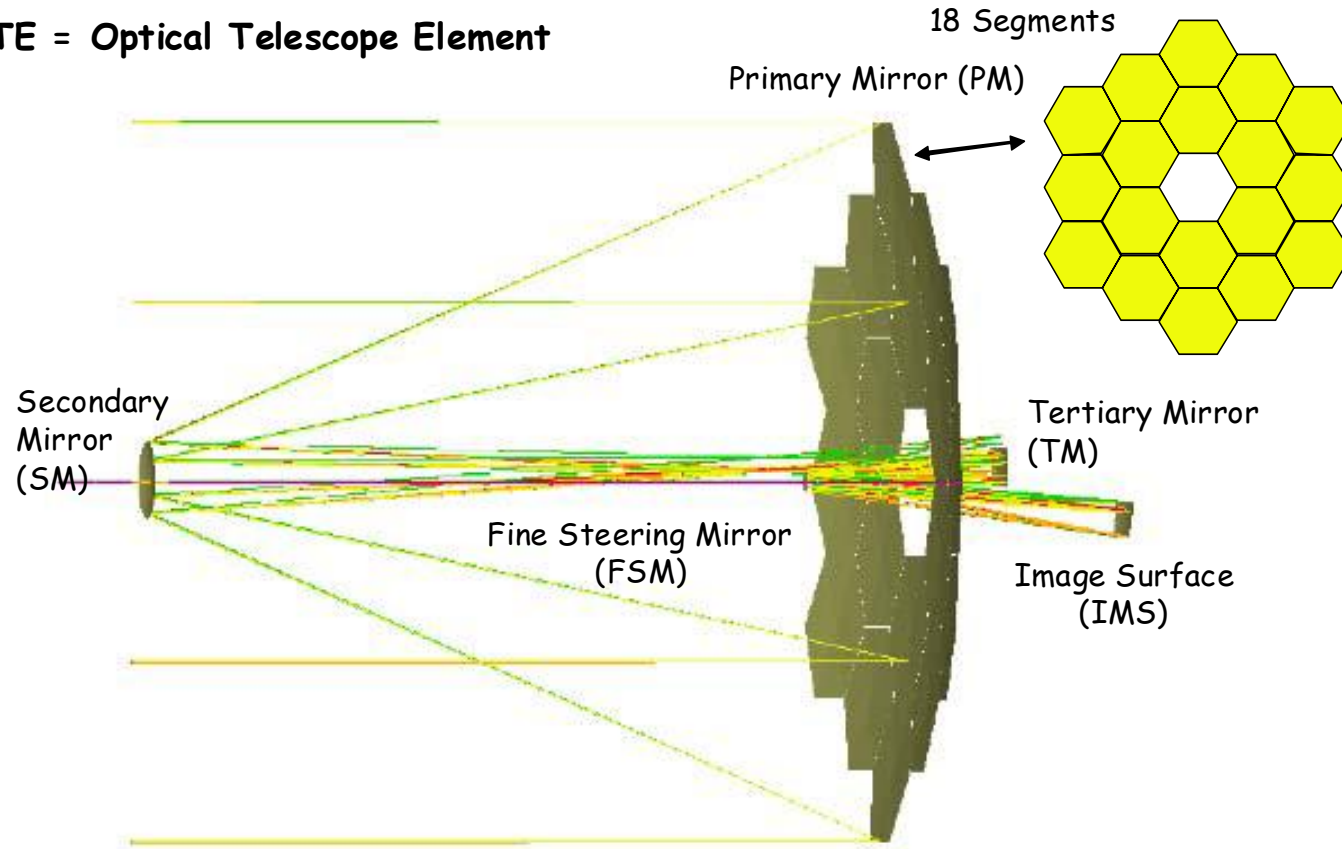


# The optics can be in reflection.



# The optics can be in reflection.

OTE = Optical Telescope Element



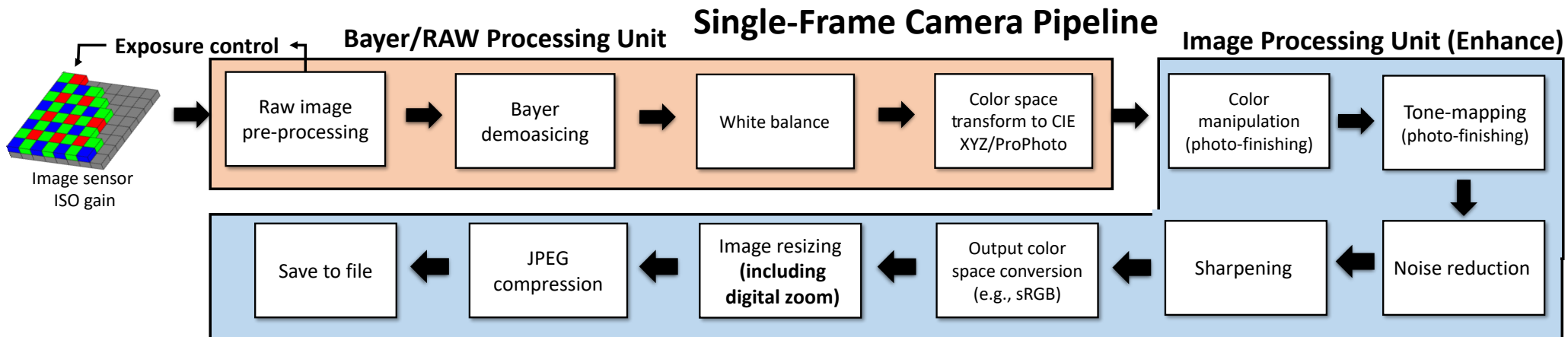
Three-Mirror-Anastigmat (TMA) design per D. Korsch

# Resources

- OpenCV - free course to get started. Open source software that you can modify.
- Arducam or similar cameras.
- Online lectures & simulation tools.
- Introduction to Machine Learning on Coursera (Andrew Ng) ([link](#))

# What happens after the image is recorded?

<https://arxiv.org/abs/2102.09000>



# Correcting Vignetting

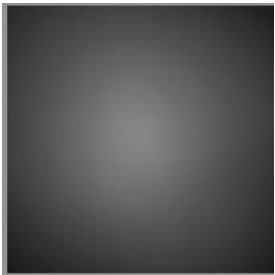
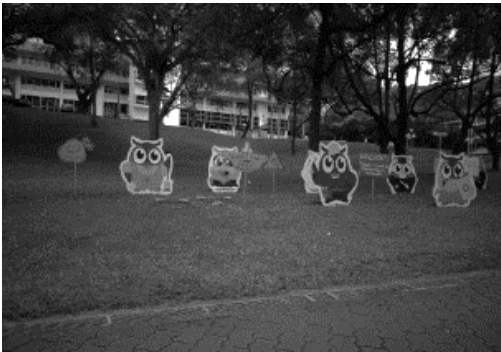


Image of a uniformly illuminated surface. The light falling on the sensor is reduced in a radial pattern.

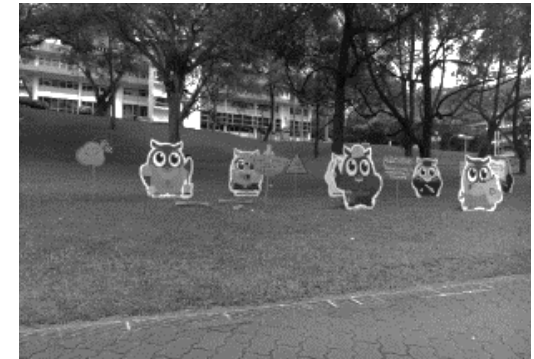
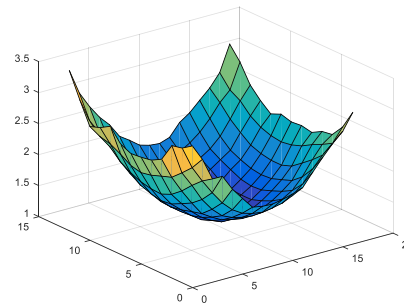
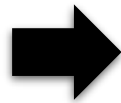


Image of a uniformly illuminated surface after lens shading correction has been applied.

Lens shading mask required to correct the radial fall-off.

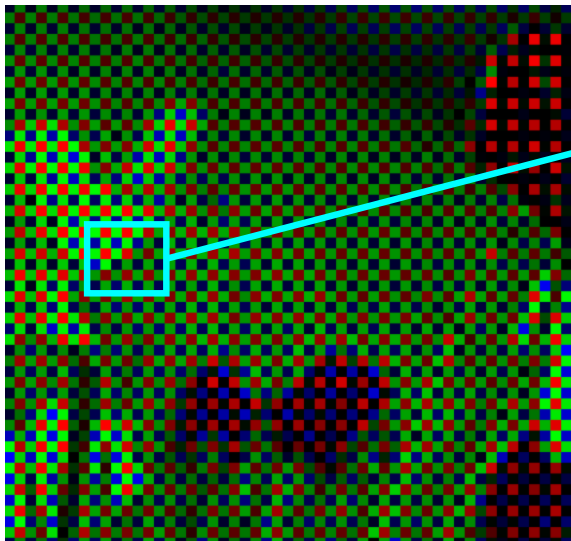


Bayer image before lens shading correction.

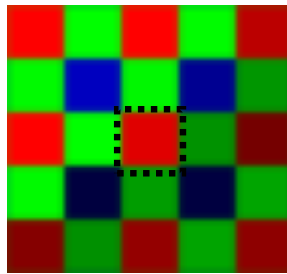


Bayer image after lens shading correction.

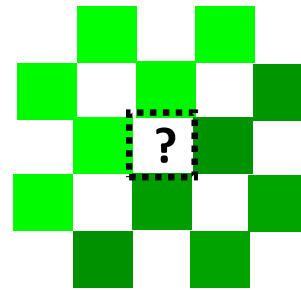
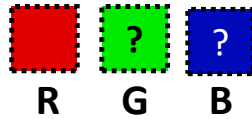
# Demosaicing



Captured raw-Bayer image



Neighborhood  
about a red  
pixel



Neighboring  
green values

0.8	0.8	0.8	0.4	0.2
0.8	0.9	0.9	0.3	0.2
0.7	0.9	1.0	0.3	0.2
0.5	0.3	0.3	0.2	0.2
0.1	0.2	0.2	0.2	0.2

Weight mask based on red pixel's  
similarity to neighboring red values.

The missing green pixel value is  
computed as a weighted interpolation  
of the neighboring green values.

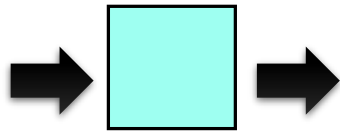


# White Balancing



raw sensor image before white-balance correction

Sensor's RGB response to scene illumination ( $\ell$ )



$$\begin{bmatrix} \ell_r \\ \ell_g \\ \ell_b \end{bmatrix} = \begin{bmatrix} 0.2 \\ 0.8 \\ 0.8 \end{bmatrix}$$

White-balance correction matrix

$$\begin{bmatrix} r_{wb} \\ g_{wb} \\ b_{wb} \end{bmatrix} = \begin{bmatrix} 1/\ell_r & 0 & 0 \\ 0 & 1/\ell_g & 0 \\ 0 & 0 & 1/\ell_b \end{bmatrix} \begin{bmatrix} r \\ g \\ b \end{bmatrix}$$

Auto white balance (AWB) algorithm estimates the illumination from the input image.



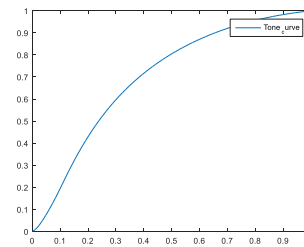
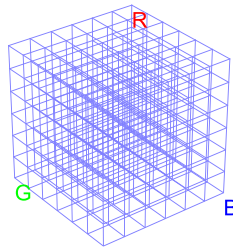
raw sensor image after white-balance correction

# Photo finishing

Different photo-finishing picture styles



Photo-Finishing



Before photo-finishing

Color manipulation  
3D LUT

Tone manipulation  
as a 1D LUT

After photo-finishing



# Many other topics ...

- Tone-mapping, sharpening, Denoising,
- Low-light imaging, super-resolution, Bokeh
- All of these are for humans, what should we do for machines (cars, robots, drones, etc.) ?