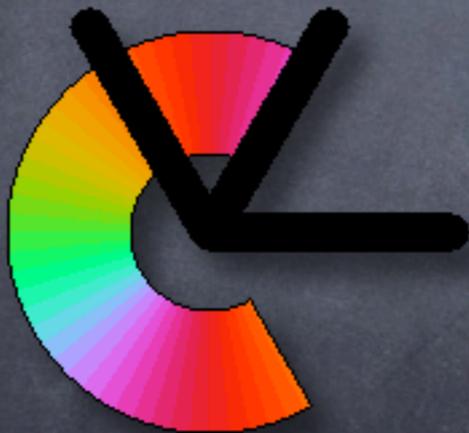


# Computer Vision on Rolling Shutter Cameras

## PART I: Introduction

Per-Erik Forssén, Erik Ringaby, Johan Hedborg



Computer Vision Laboratory  
Dept. of Electrical Engineering  
Linköping University

**CVPR 2012**  
Providence, Rhode Island  
June 16-21, 2012



**Linköping University**  
INSTITUTE OF TECHNOLOGY

# Lectures by



Per-Erik Forssén



Erik Ringaby



Johan Hedborg

# Tutorial overview

1:30–2:00pm	<b>Introduction</b>	<b>Per-Erik</b>
2:00–2:15pm	Rolling Shutter Geometry	Per-Erik
2:15–3:00pm	Rectification and Stabilisation	Erik
3:00–3:30pm	Break	
3:30–3:45pm	Rolling Shutter and the Kinect	Erik
3:45–4:30pm	Structure from Motion	Johan

<http://www.cvl.isy.liu.se/education/tutorials/rolling-shutter-tutorial>

# What is a rolling shutter?



- Hand held  $\Rightarrow$  non-smooth camera path
- Geometric distortions (wobble)
- HTC desire (Q2 2010)

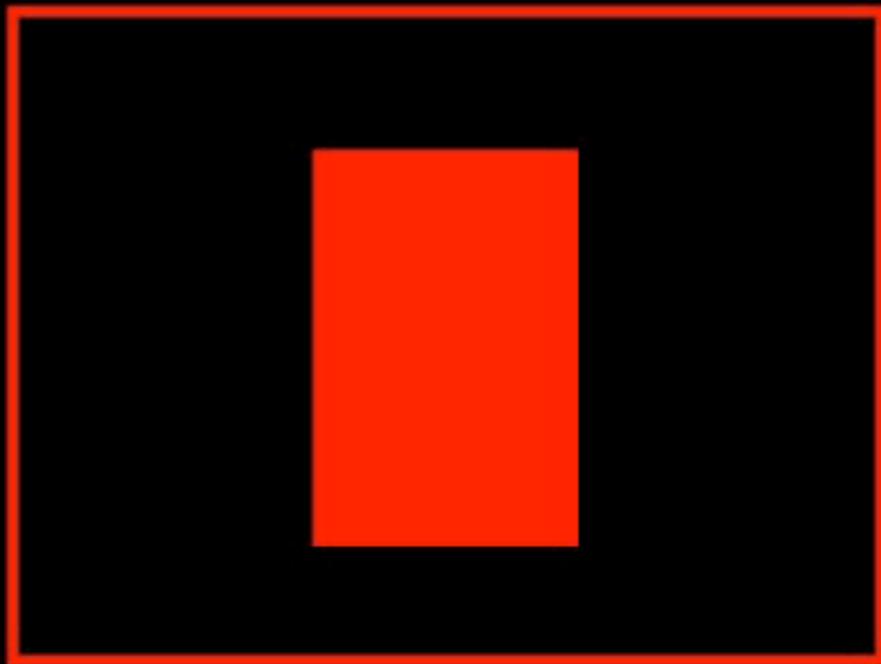


# What is a rolling shutter?

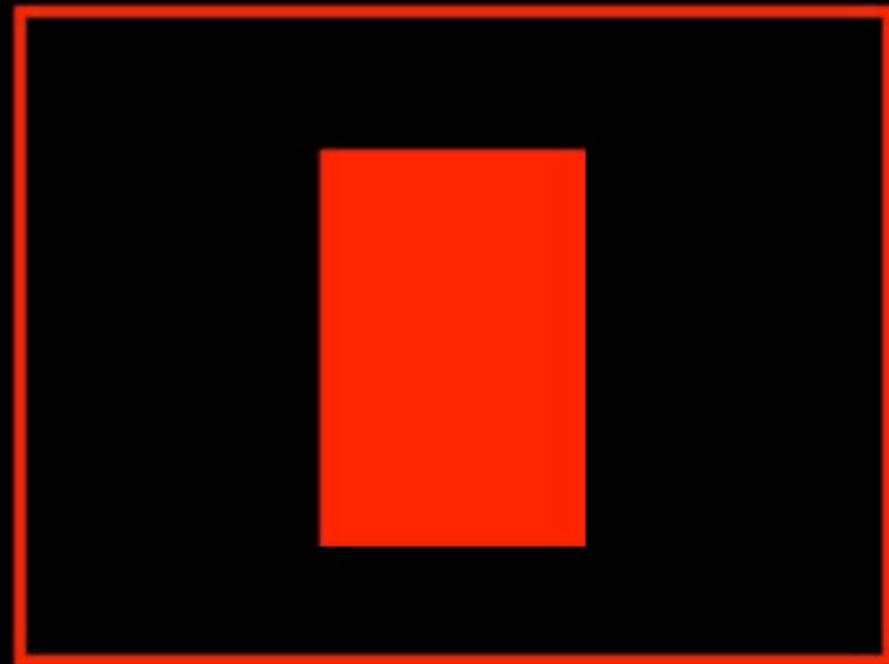


# What is a rolling shutter?

- In rolling shutter image acquisition, rows are exposed sequentially



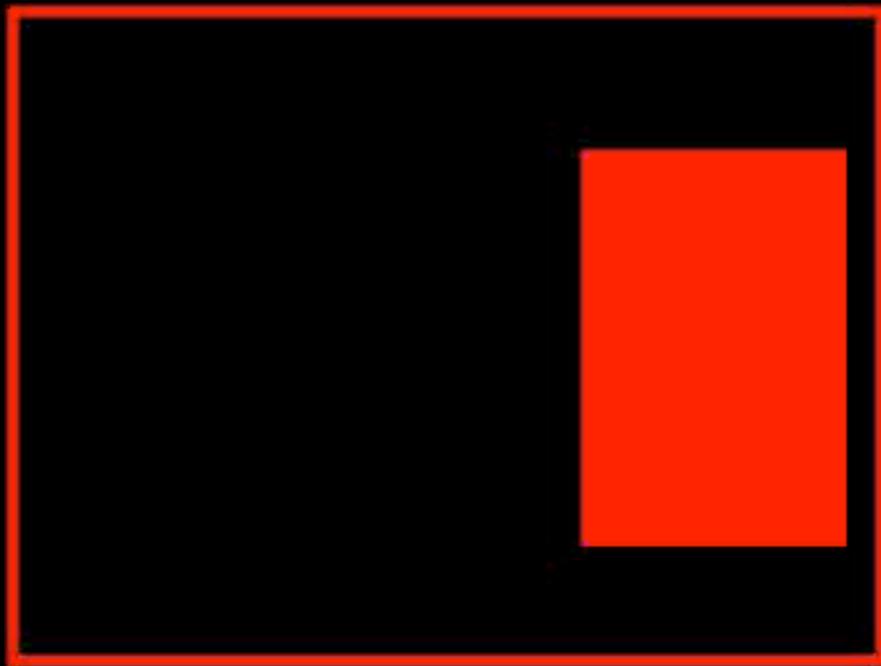
Static Scene



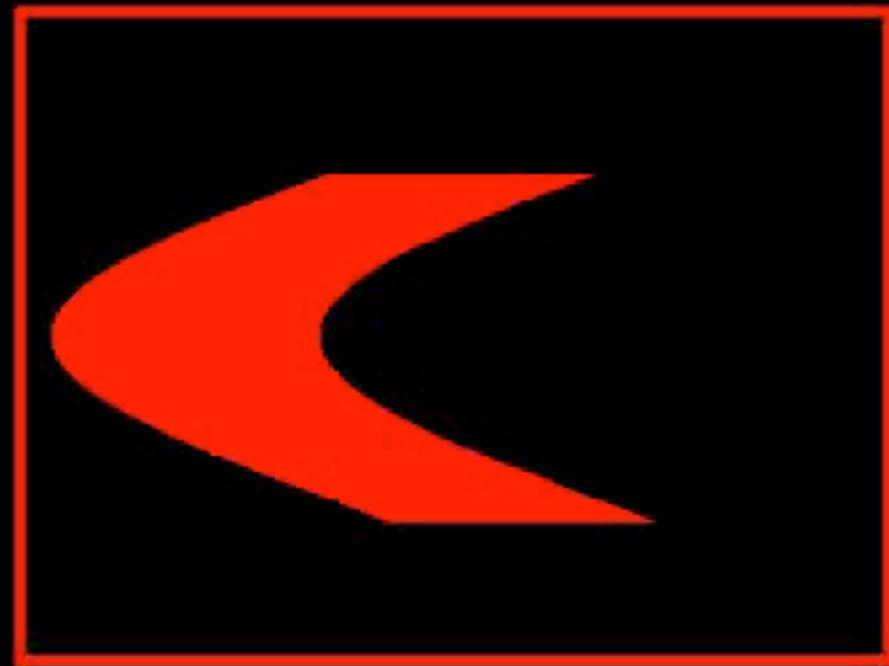
Captured Image

# What is a rolling shutter?

- In rolling shutter image acquisition, rows are exposed sequentially



Dynamic Scene



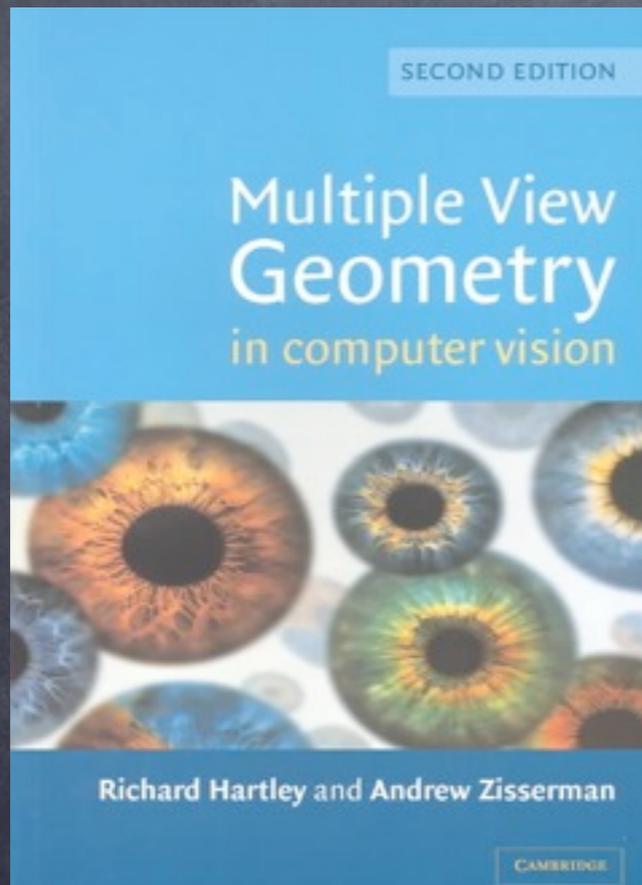
Captured Image

# Why care about rolling shutters?

- The scientific perspective: Problem not solved yet.

# Why care about rolling shutters?

- The scientific perspective: Problem not solved yet.
- Hartley & Zisserman Multiple View Geometry 2nd ed 2004



- THE reference on geometry in Computer Vision
- 10,000+ citations in Google Scholar
- Does not mention rolling shutter

# Why care about rolling shutters?

- The scientific perspective: Problem not solved yet.
- The practical perspective: I want to do computer vision on consumer cameras or new robot platforms.

# Why care about rolling shutters?

- The scientific perspective: Problem not solved yet.
- The practical perspective: I want to do computer vision on consumer cameras or new robot platforms.



"Research PatrolBot" from  
Adept MobileRobots  
Demoed at ICRA 2012



"Scout" from ReconRobotics  
Demoed at ICRA 2012

**AUTOMATON** *The future of robots and other silicon-brained machines*

**ieee** INSIDE TECHNOLOGY  
**spectrum**

# Computer Vision

- When is the rolling shutter effect relevant for computer vision?

# Computer Vision

- When is the rolling shutter effect relevant for computer vision?

- 3D modelling from images

- Visual SLAM

- Video stabilisation algorithms, Video panoramas etc.



# Computer Vision

- When is the rolling shutter effect relevant for computer vision?

- 3D modelling from images

- Visual SLAM

- Video stabilisation algorithms, Video panoramas etc.

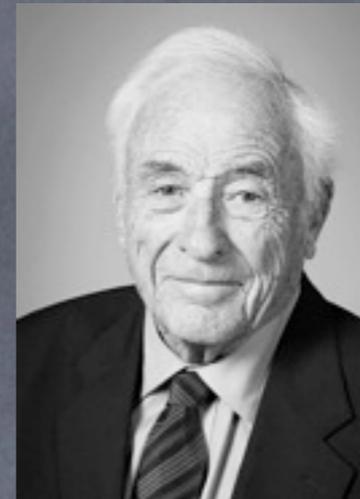
- Any geometric measurement from images



# Image sensors: CMOS vs. CCD

• Nobel Prize in Physics 2009

to Willard S. Boyle  
and George E. Smith

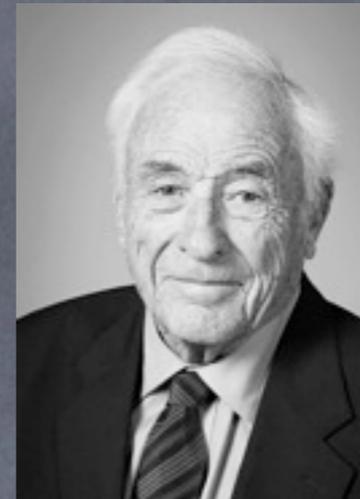


"for the invention of an imaging semiconductor circuit – the CCD sensor"  
Invented around 1970, patent filed September 1971.

# Image sensors: CMOS vs. CCD

- Nobel Prize in Physics 2009

to Willard S. Boyle  
and George E. Smith



"for the invention of an imaging semiconductor circuit – the CCD sensor"  
Invented around 1970, patent filed September 1971.

- CMOS – The new deal  
Modern CMOS sensor work started in mid 1980s  
at VLSI Vision Ltd and at the Jet Propulsion Laboratory (JPL)
- Most CMOS sensors, by design, have rolling shutters

# CMOS and CCD markets 2012

- CCD sensors in Astronomy and MachineVision



Spectral Instruments  
12MP CCD 95x95mm



PointGrey Research  
Gazelle2 and Bumblebee2  
Machine Vision cameras

# CMOS and CCD markets 2012

CMOS sensors everywhere else



Hand-held devices with cameras

Camcorders

compact and SLR cameras



Robots and toys



Consumer Structured Light Sensors (e.g. Kinect)



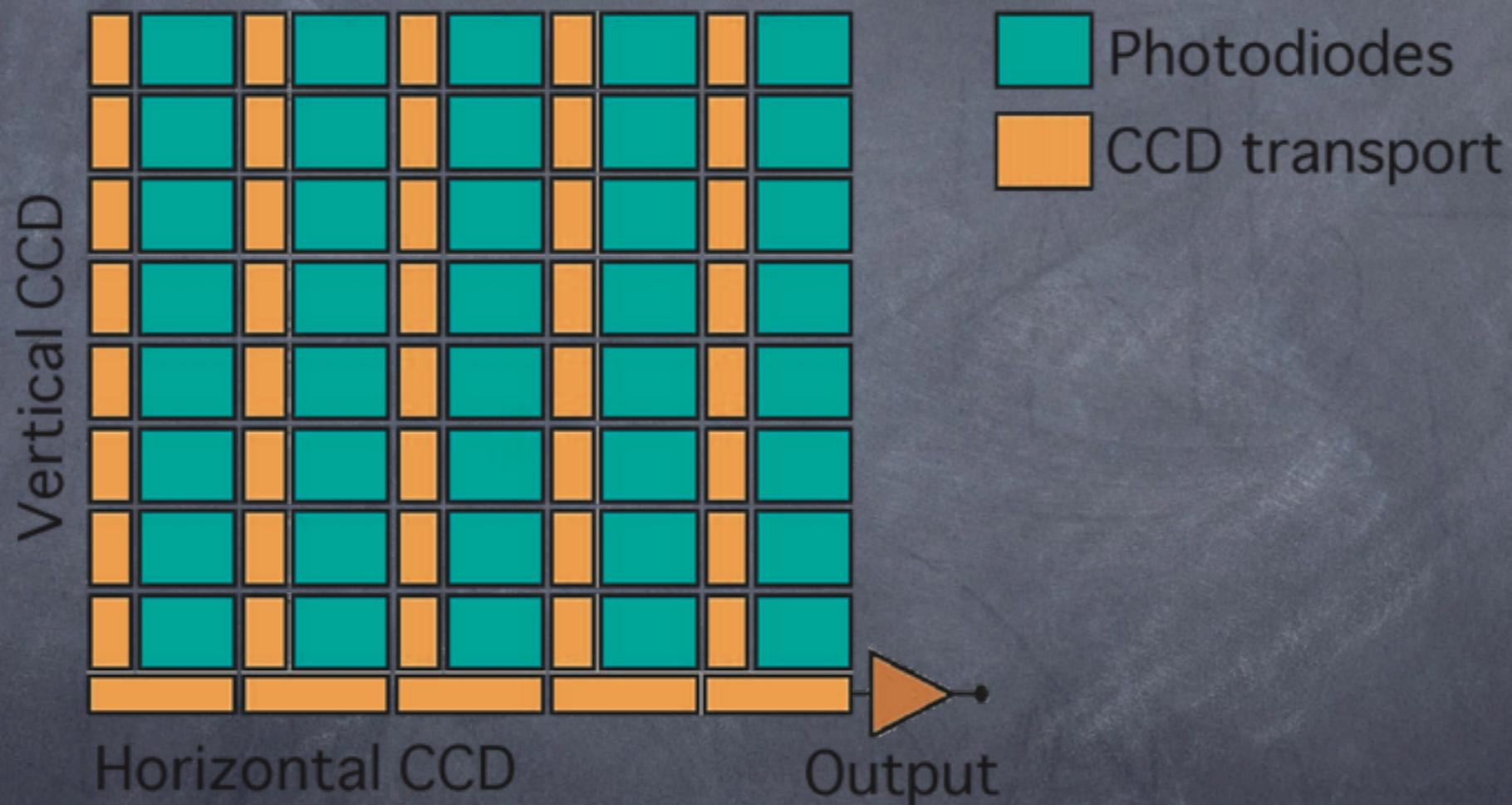
High-end motion-picture cameras

# Why is CMOS winning over CCD?

- New chips are designed for the consumer mass market. Advantages for CMOS here:
  - Cheaper manufacturing (lower price)
  - Allows on-chip processing
  - Makes HD video affordable
- Rolling shutter is not a big problem for consumers (casual users cause worse artifacts themselves)

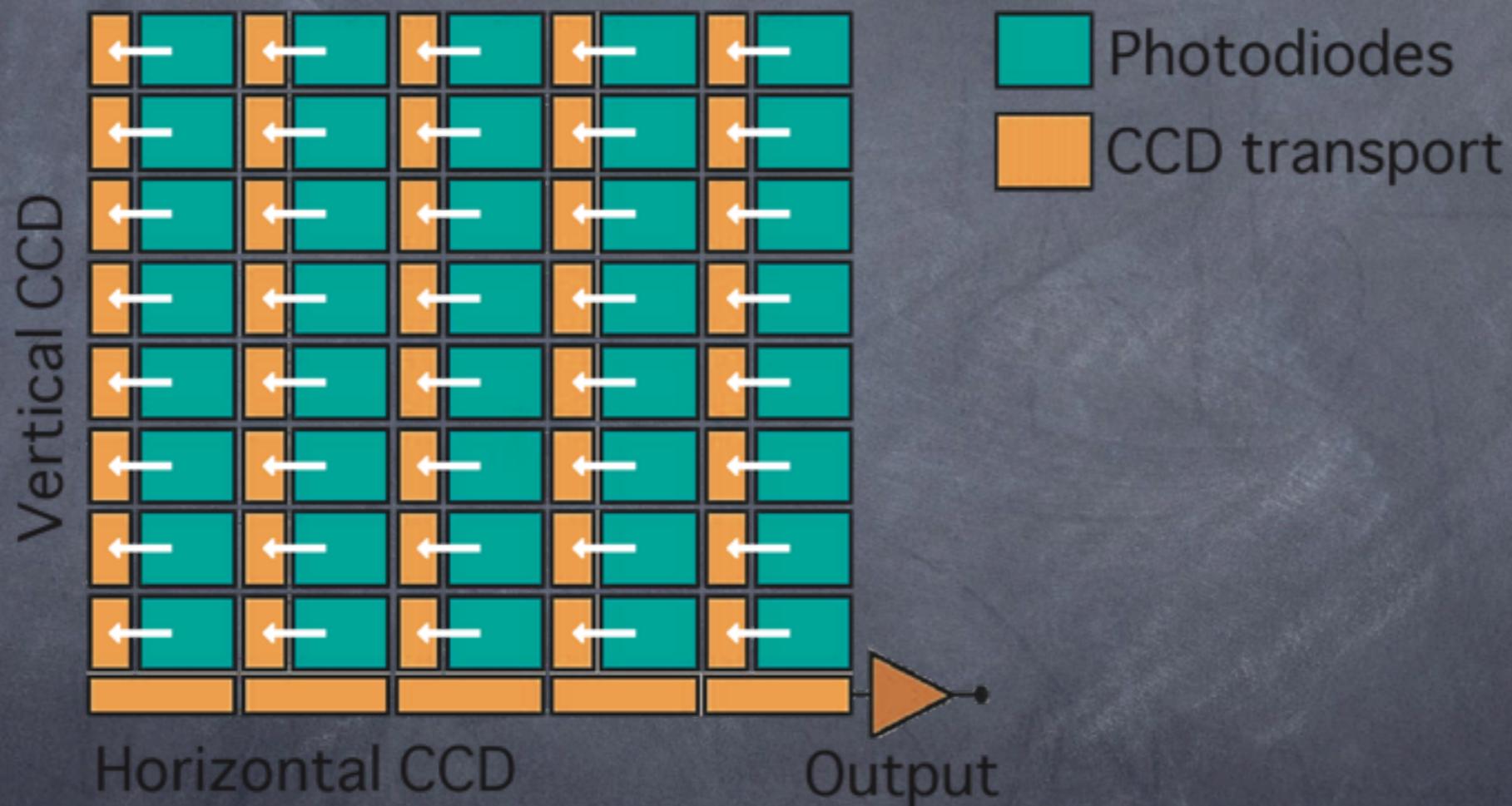
# The CCD sensor

- Charged Coupled Device (CCD)



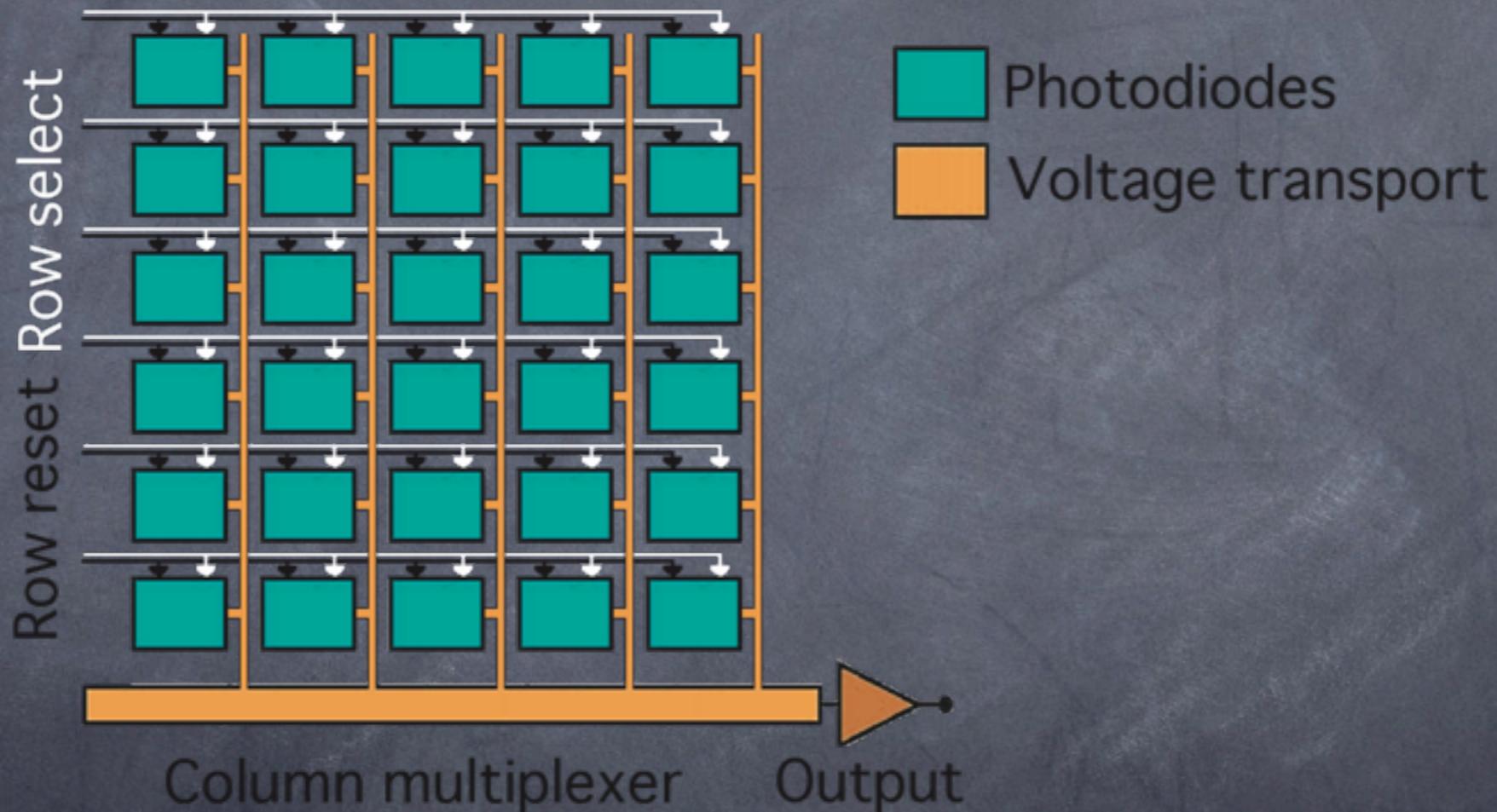
# The CCD sensor

- Charged Coupled Device (CCD)



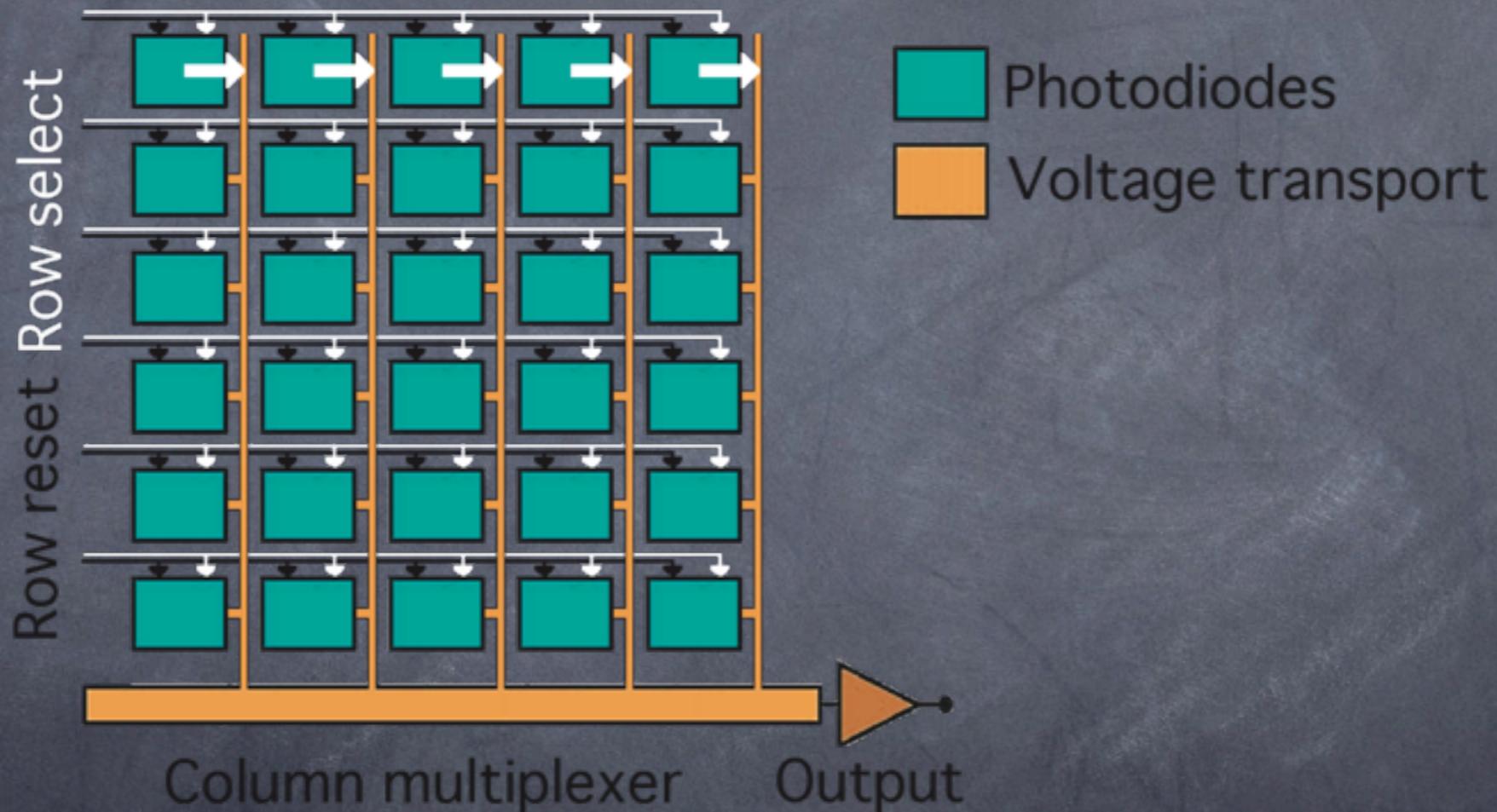
# The non-buffered CMOS sensor

- Complementary Metal Oxide Semiconductor (CMOS)



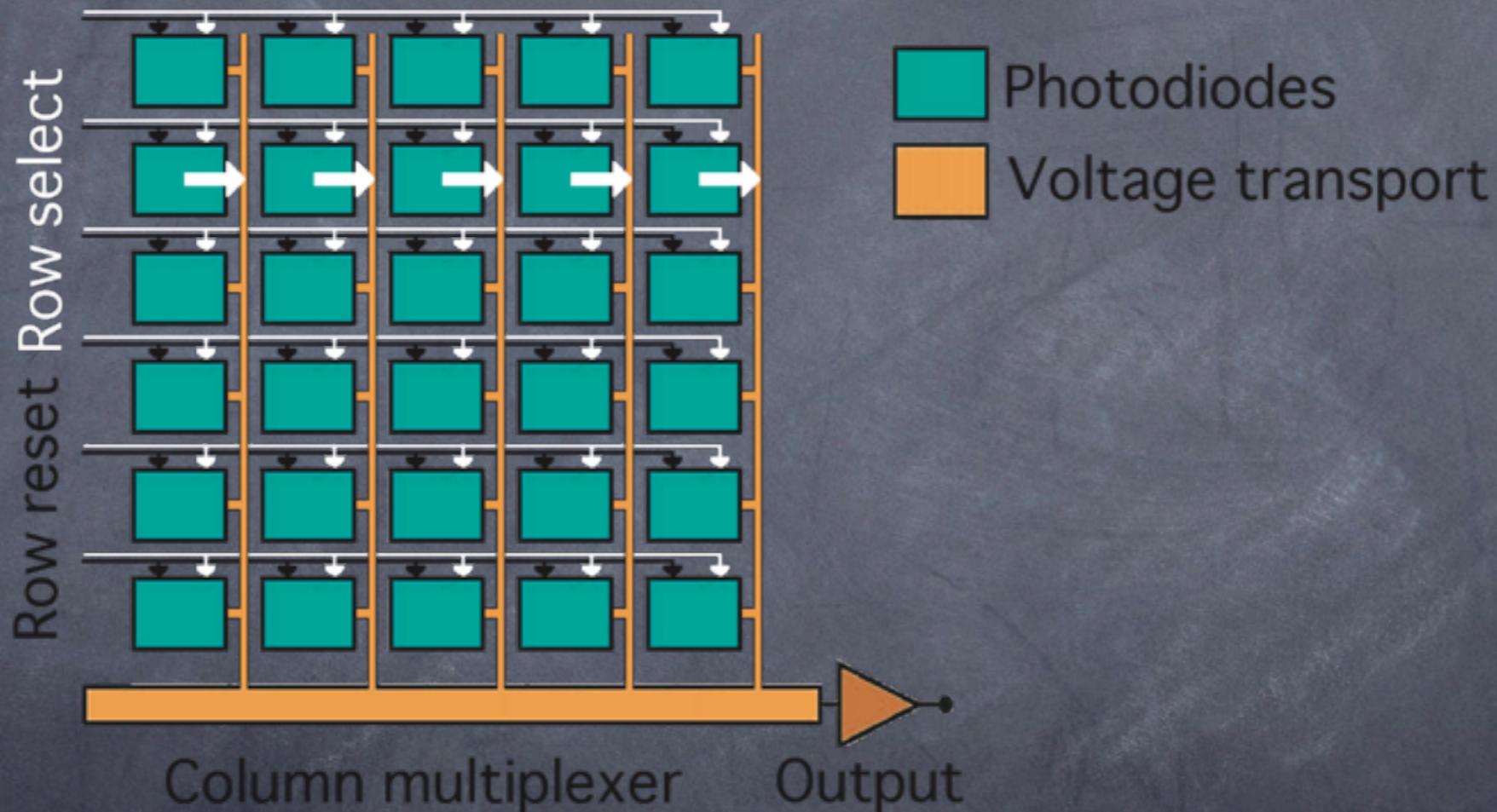
# The non-buffered CMOS sensor

- Complementary Metal Oxide Semiconductor (CMOS)



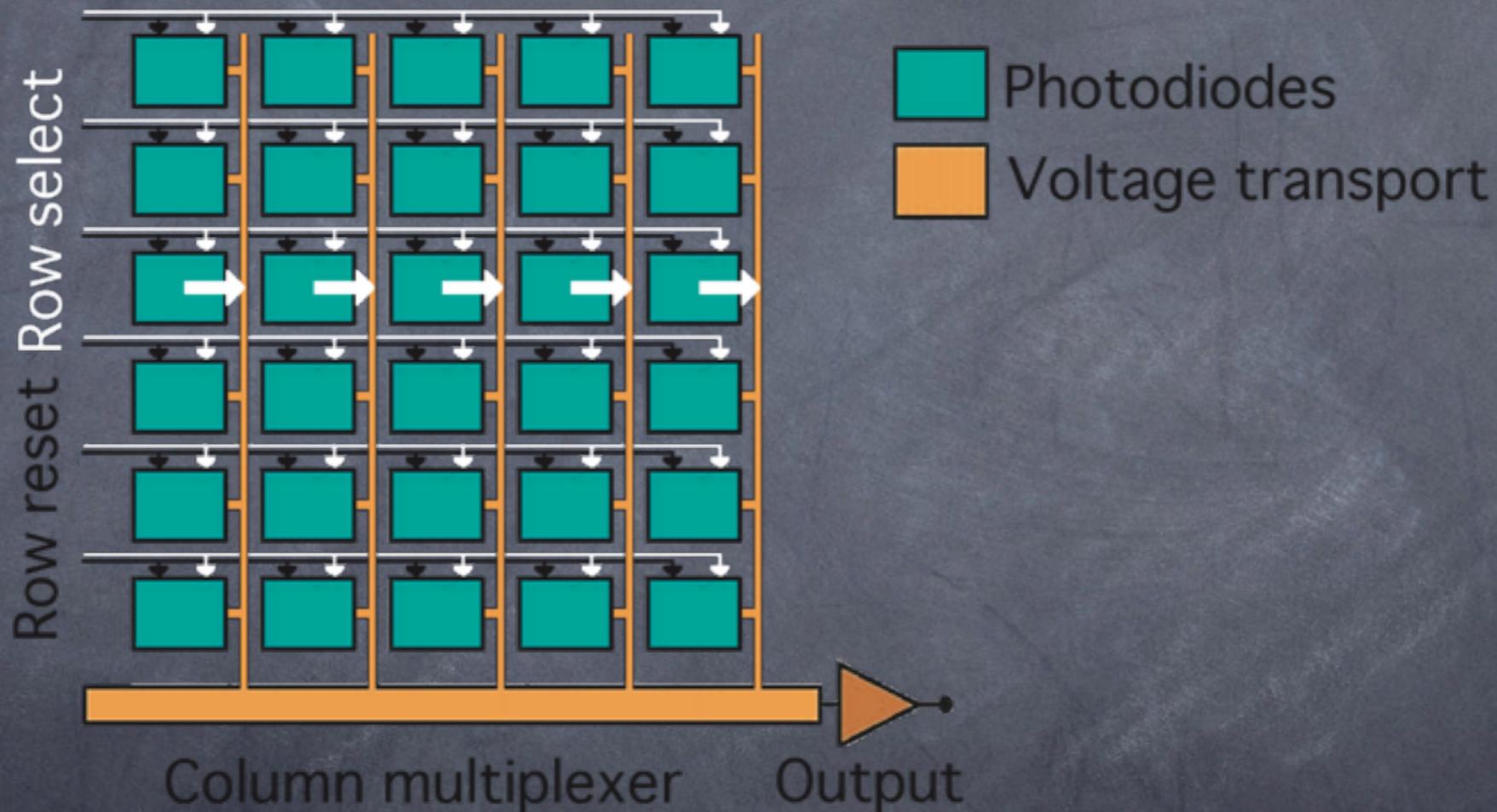
# The non-buffered CMOS sensor

- Complementary Metal Oxide Semiconductor (CMOS)



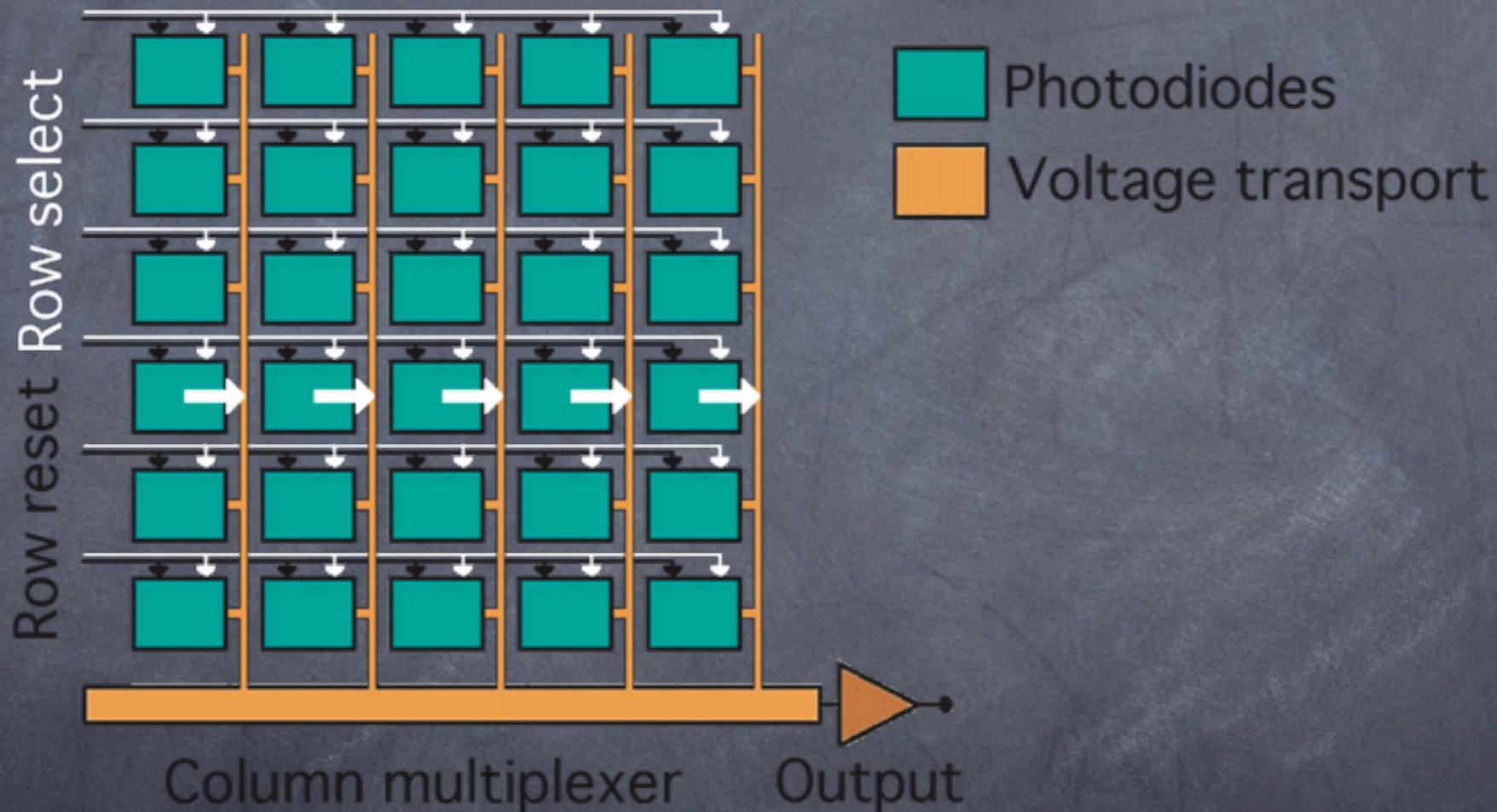
# The non-buffered CMOS sensor

- Complementary Metal Oxide Semiconductor (CMOS)



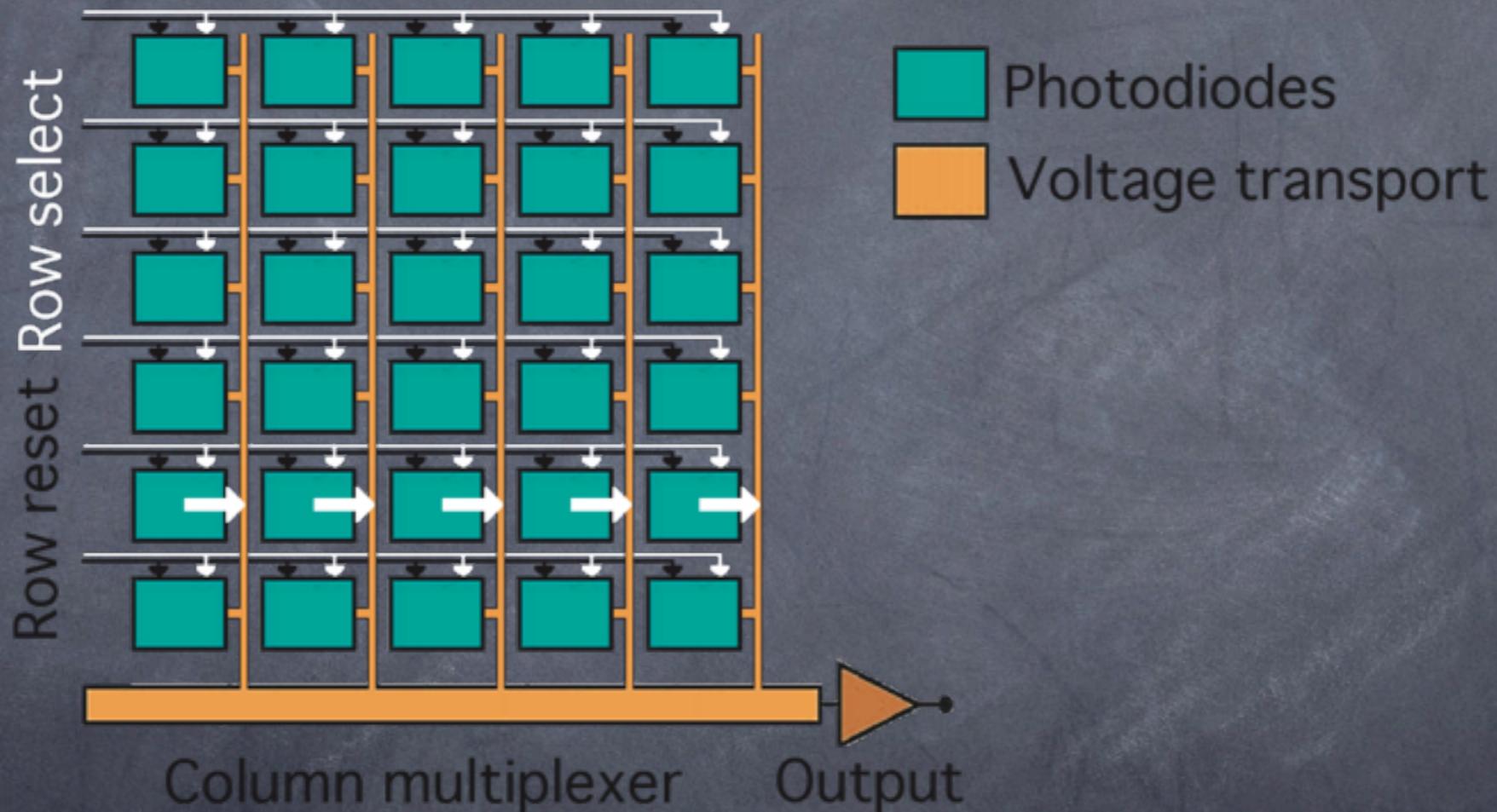
# The non-buffered CMOS sensor

- Complementary Metal Oxide Semiconductor (CMOS)



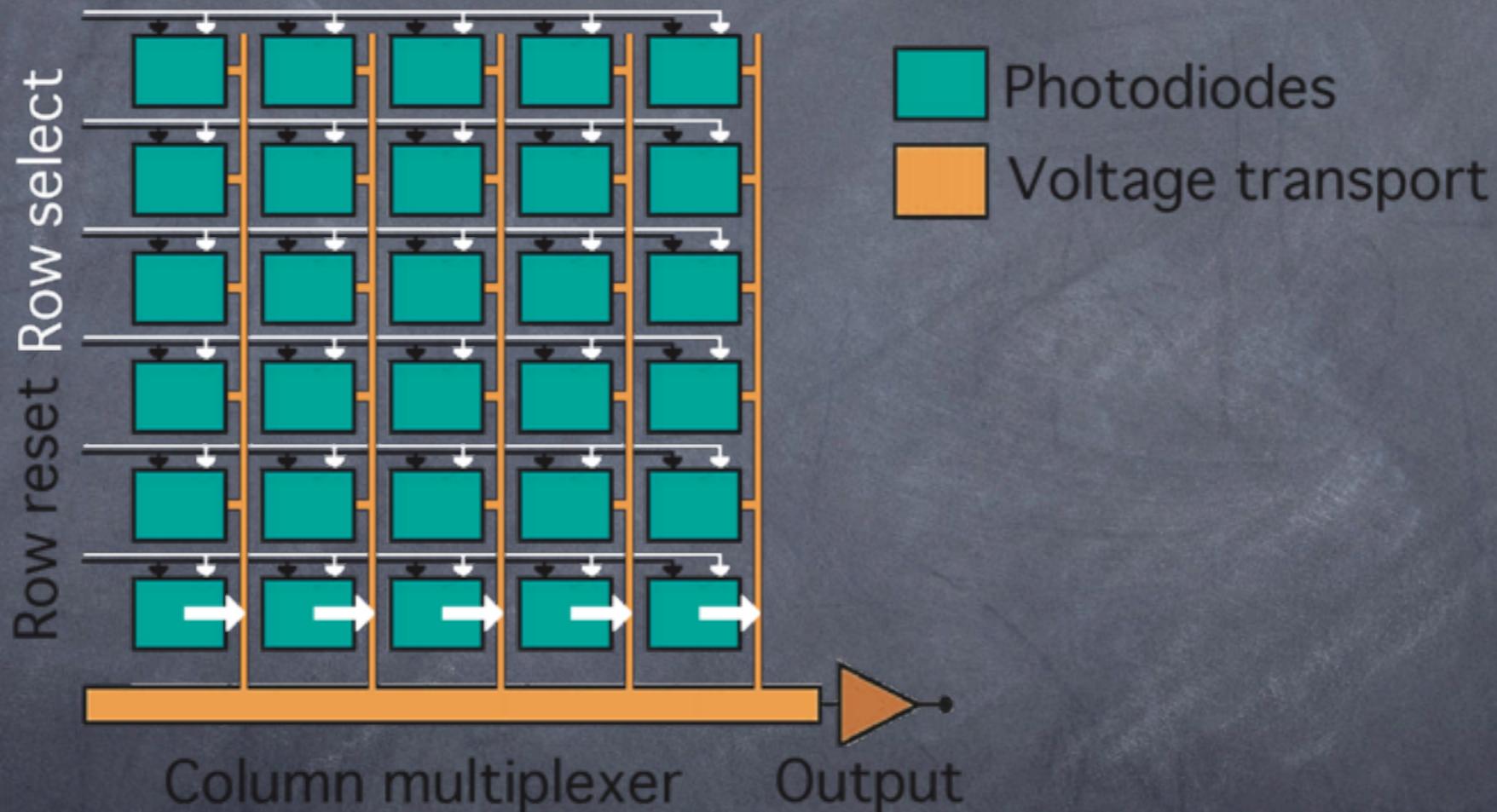
# The non-buffered CMOS sensor

- Complementary Metal Oxide Semiconductor (CMOS)



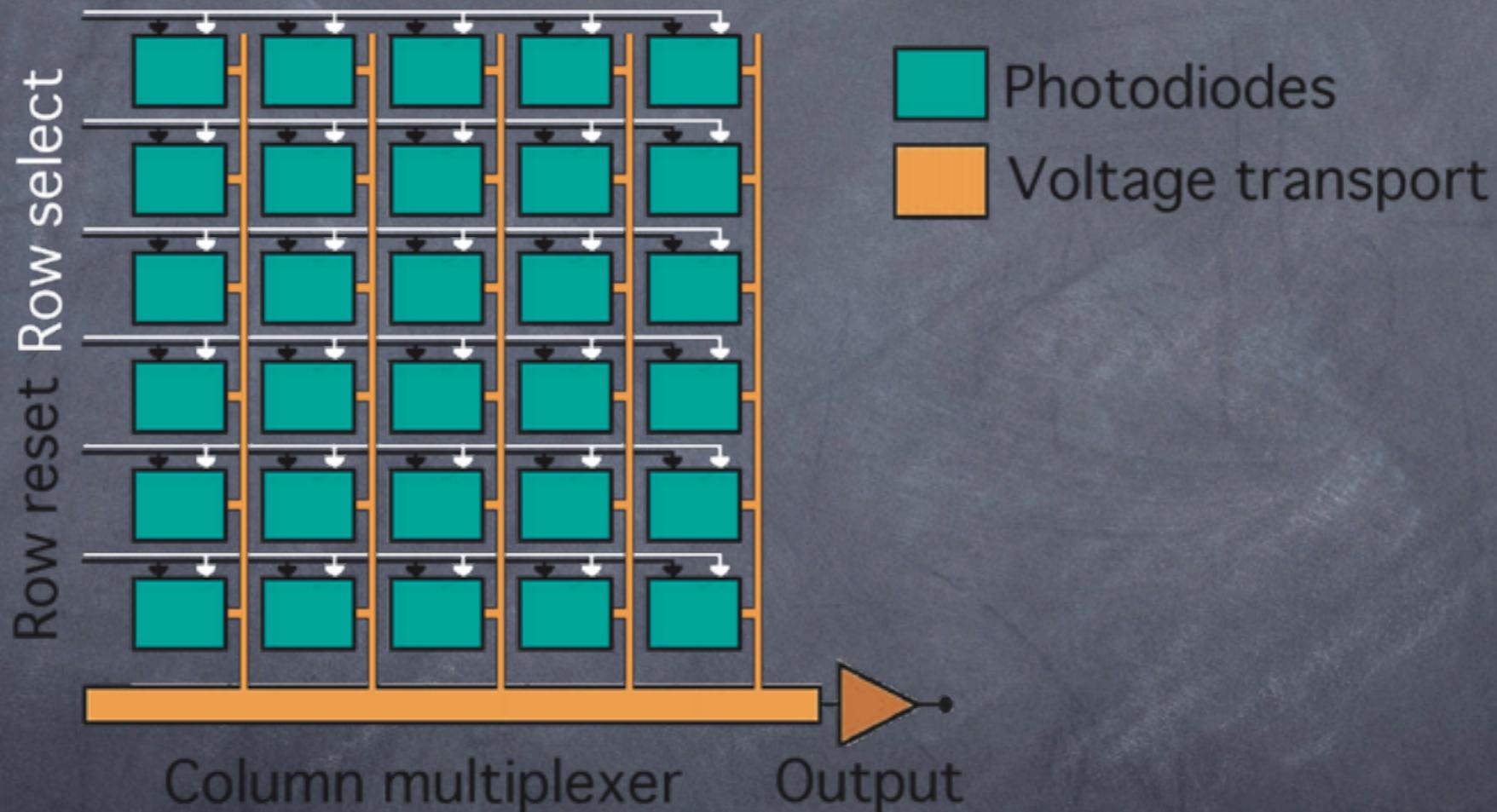
# The non-buffered CMOS sensor

- Complementary Metal Oxide Semiconductor (CMOS)



# The non-buffered CMOS sensor

- Complementary Metal Oxide Semiconductor (CMOS)



- Electronic Rolling Shutter (ERS)

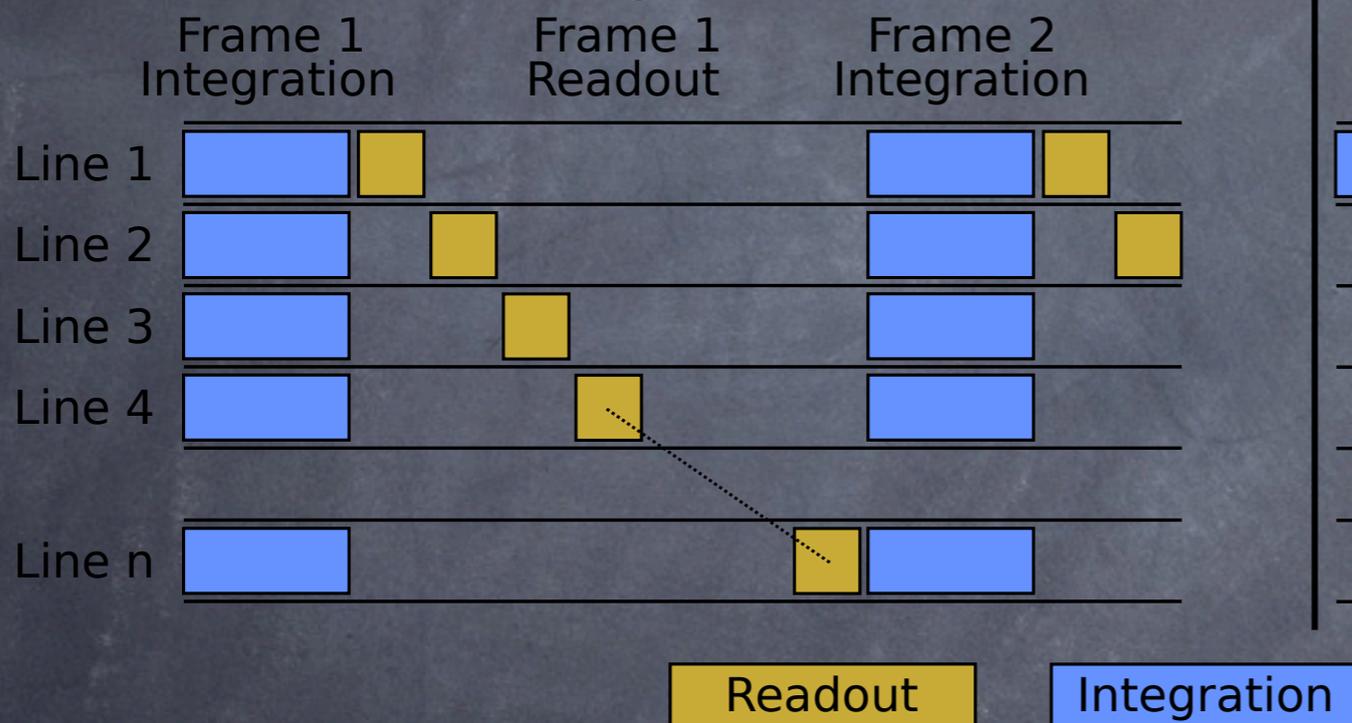
# Buffered CMOS sensors

- CMOS sensors with global-shutter since 1999
- Implemented by per-pixel memory buffer
- Buffering requires:
  - careful shielding
  - better micro-lenses and larger sensor to compensate for reduced fill-factor
- More expensive than ERS, but competitive in the same markets as CCD sensors

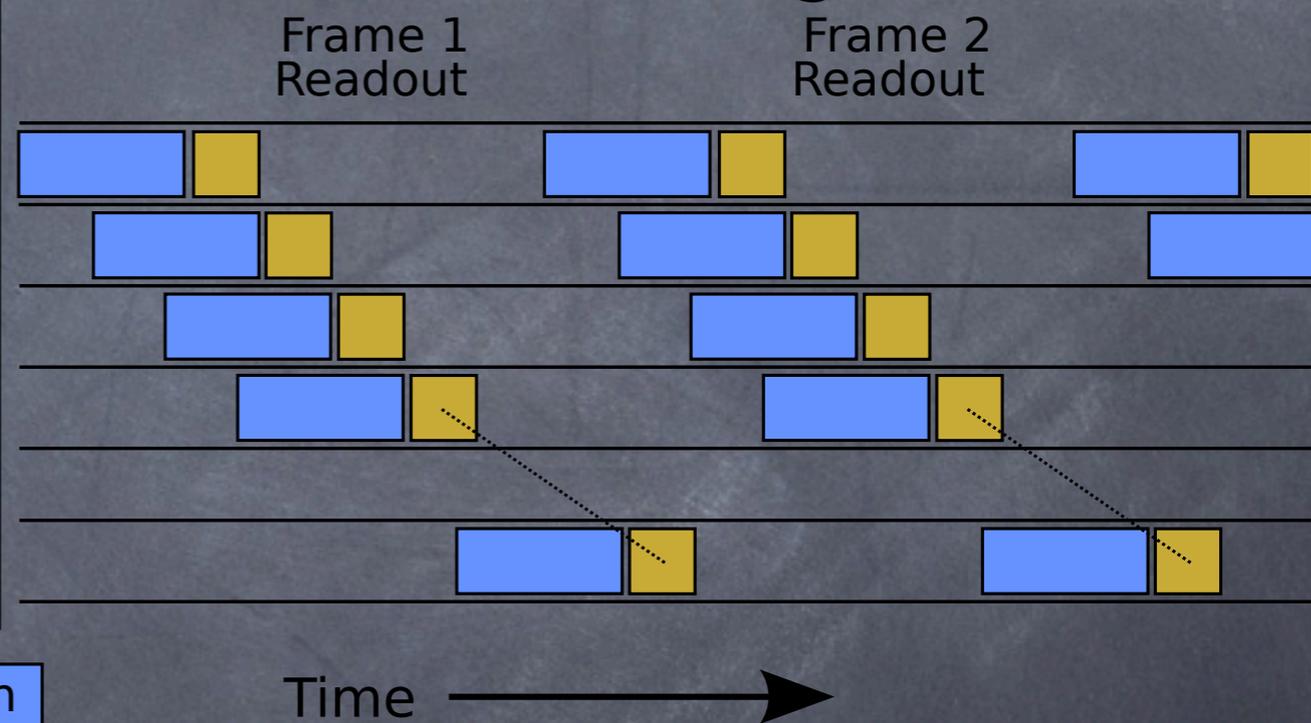
# Global vs. rolling shutter

- Image rows are read sequentially

## Mechanical global shutter



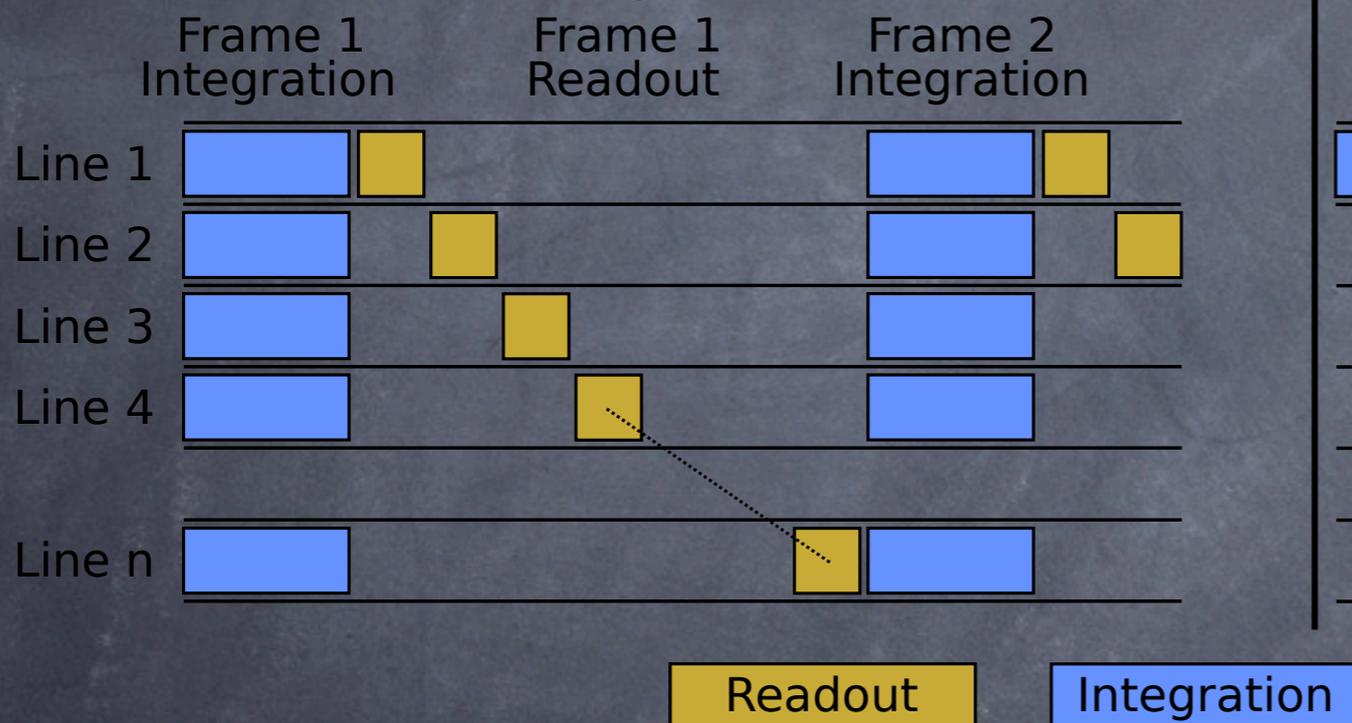
## Electronic rolling shutter



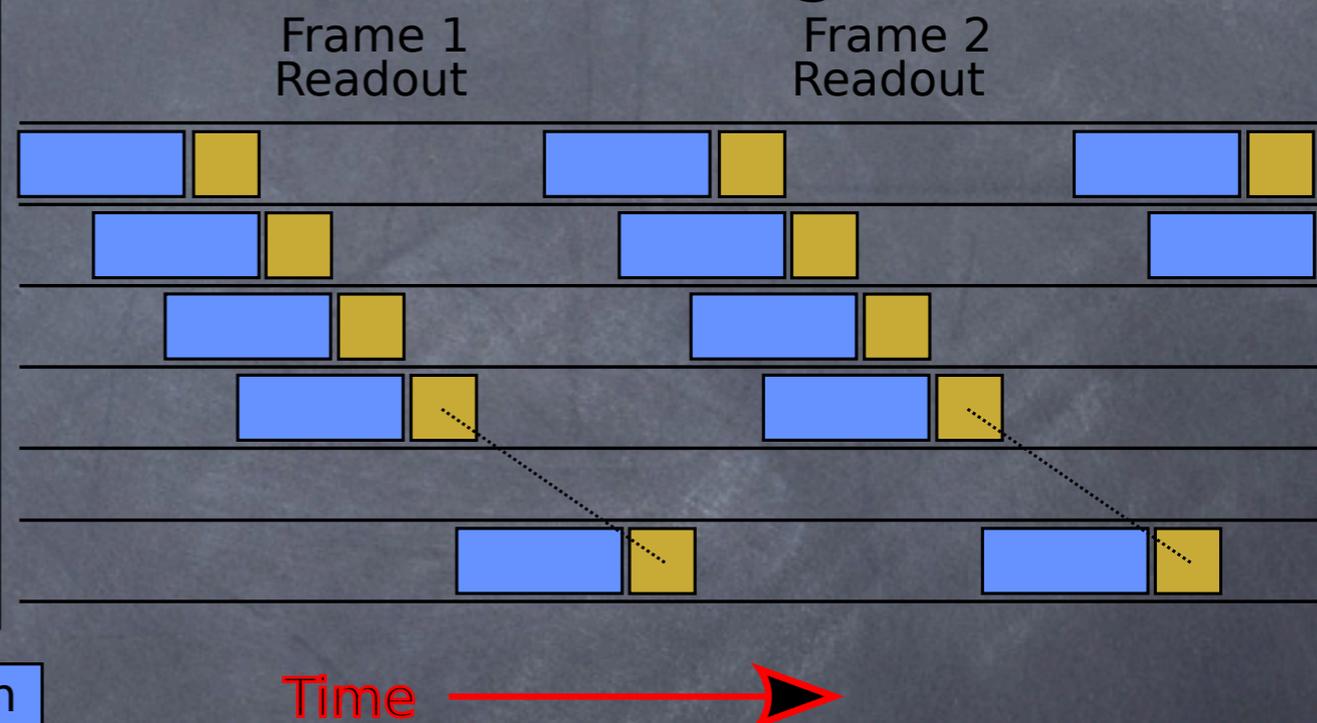
# Global vs. rolling shutter

- Image rows are read sequentially

## Mechanical global shutter



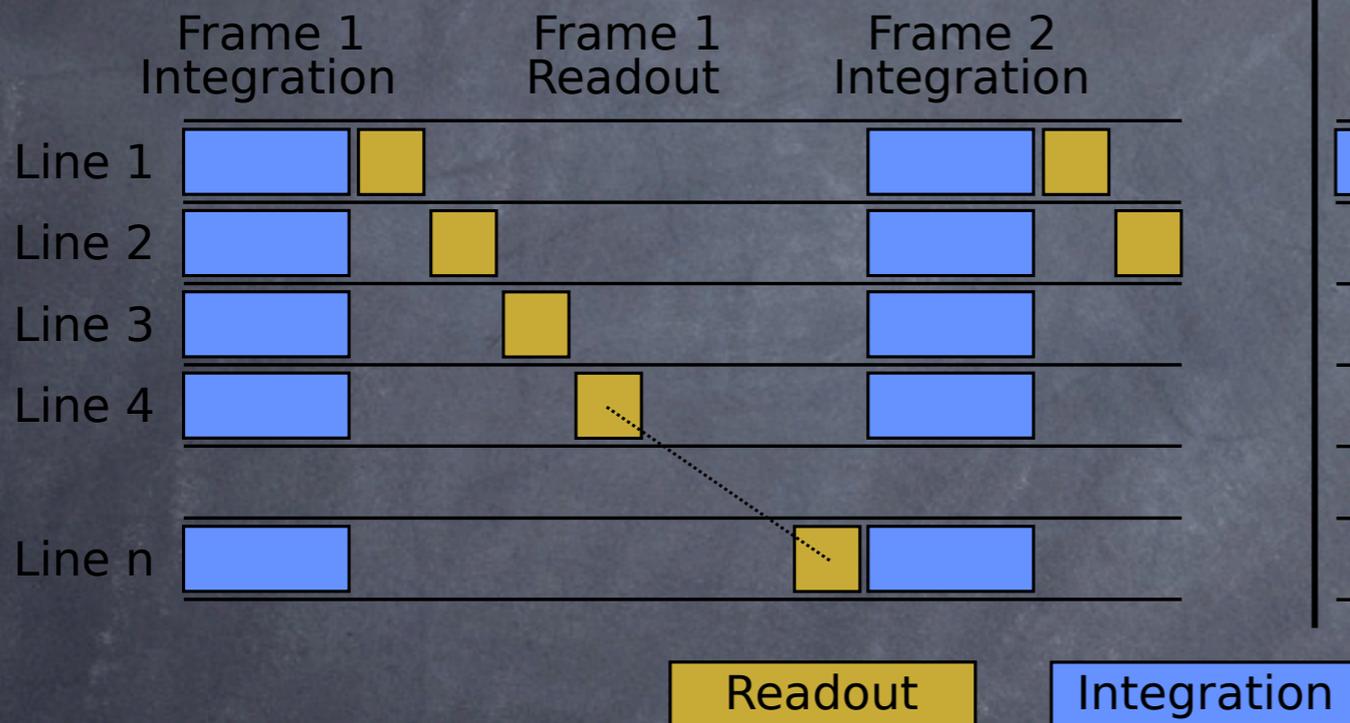
## Electronic rolling shutter



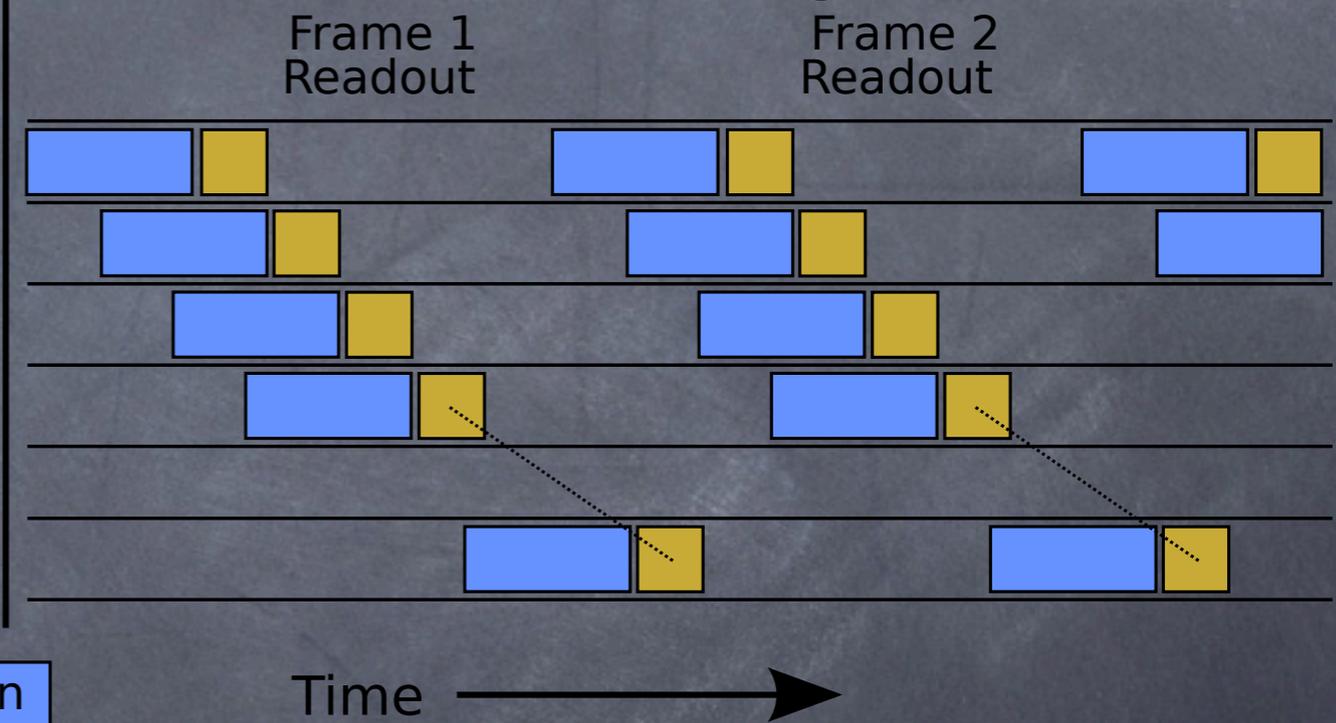
# Global vs. rolling shutter

- Image rows are read sequentially

## Mechanical global shutter



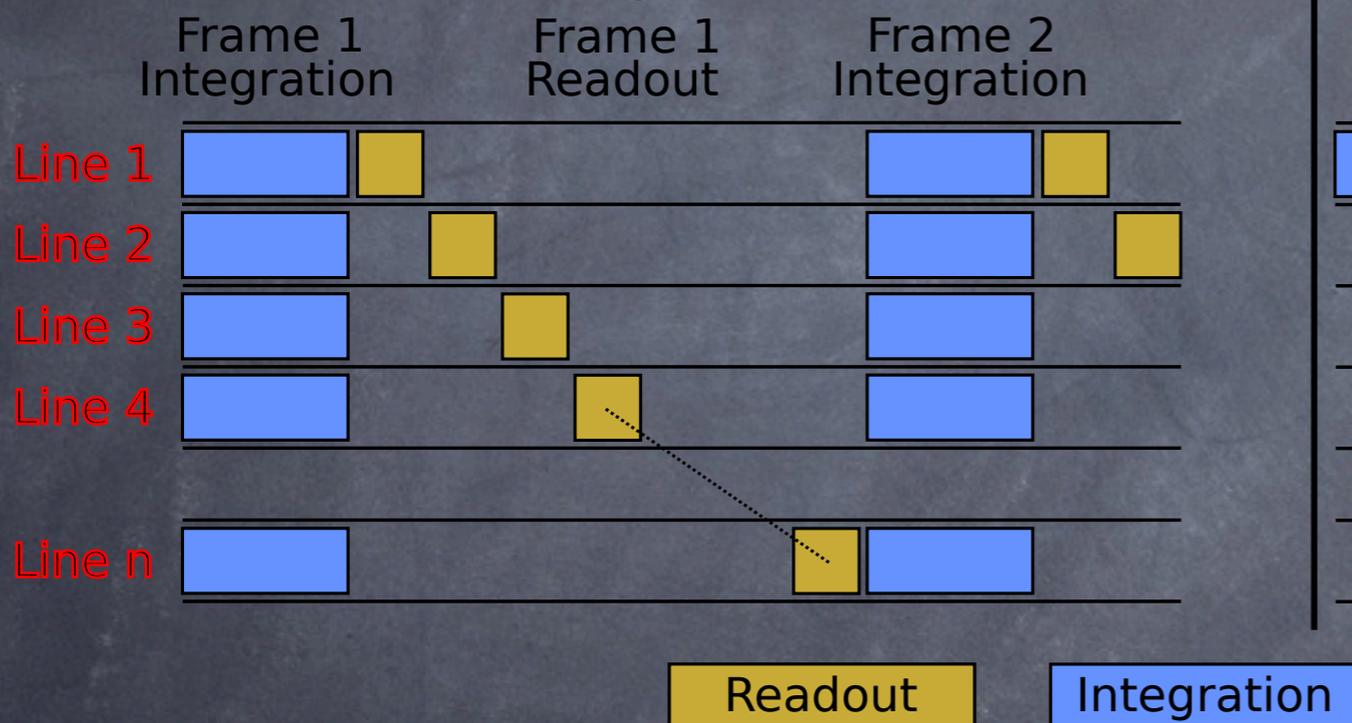
## Electronic rolling shutter



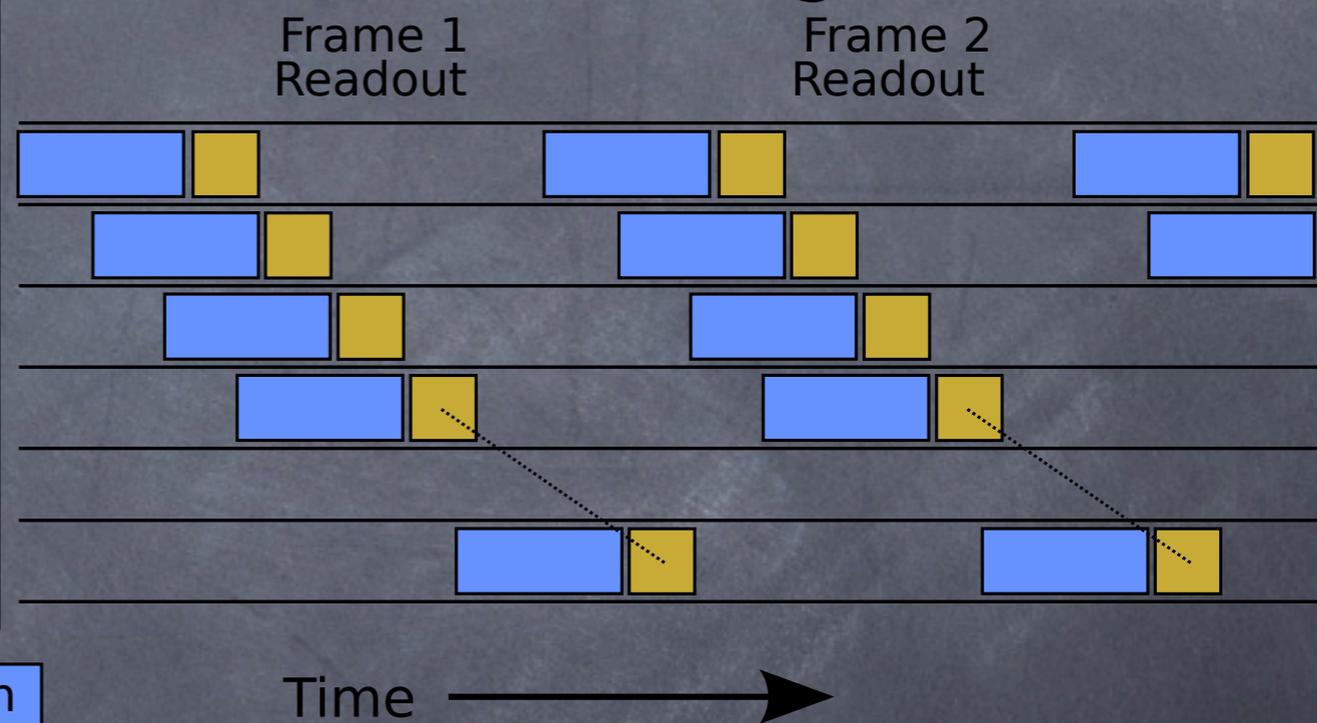
# Global vs. rolling shutter

- Image rows are read sequentially

## Mechanical global shutter



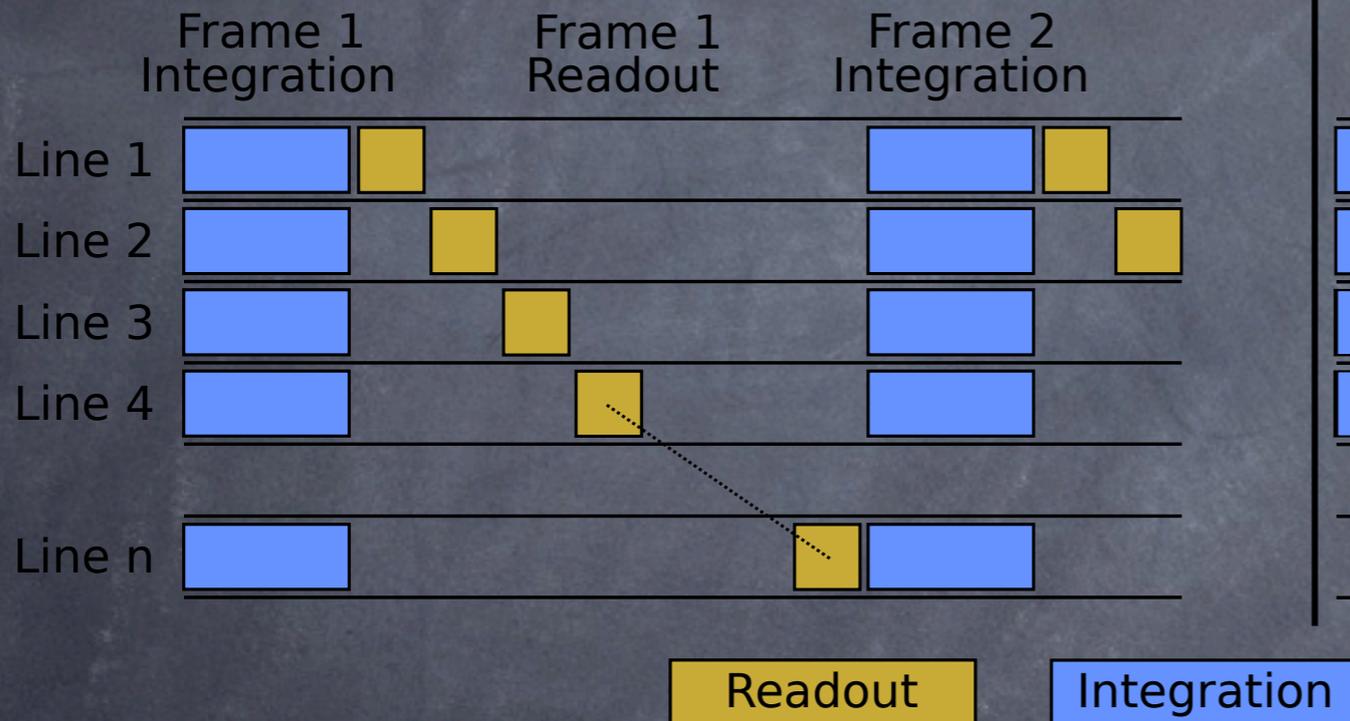
## Electronic rolling shutter



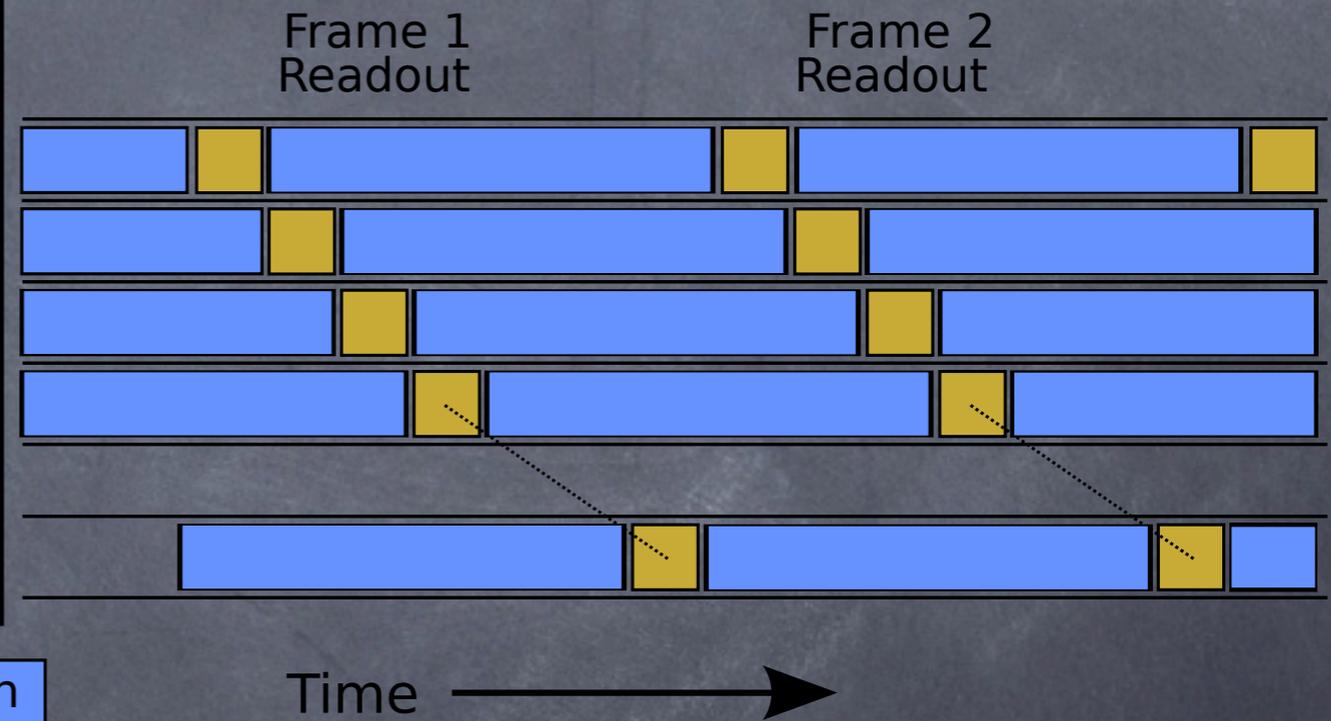
# Global vs. rolling shutter

- Image rows are read sequentially

## Mechanical global shutter



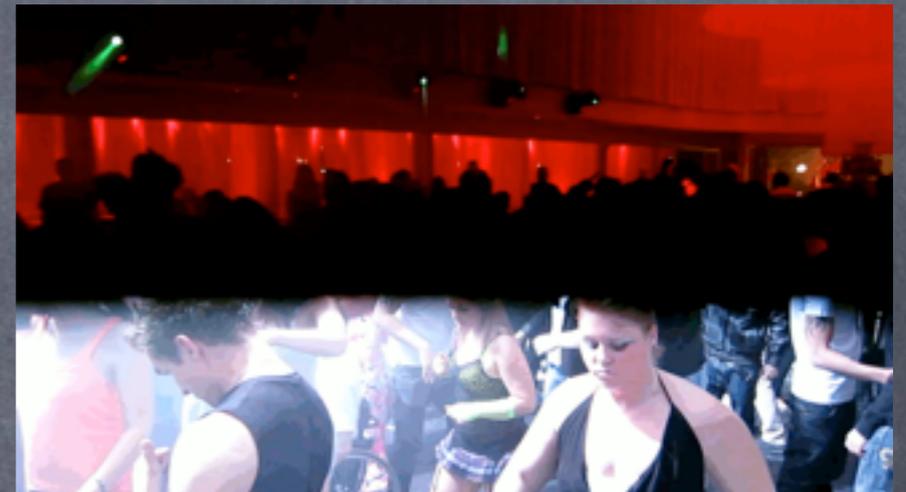
## Electronic rolling shutter



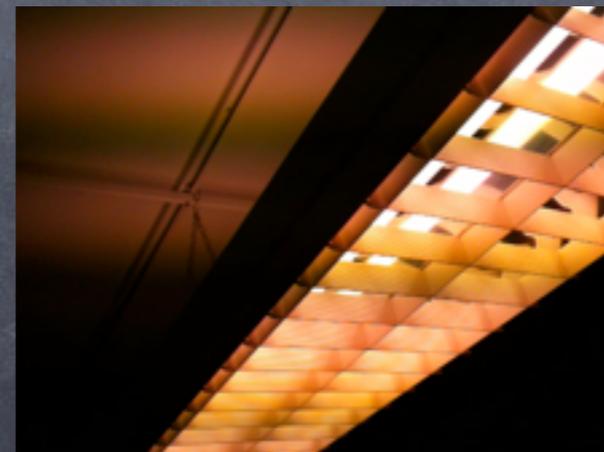
- Rolling shutter allows for longer integration
- No mechanical shutter or on-chip buffer needed

# Rolling shutter artifacts

- ① motion:
  - ① wobble (vibrating motion)
  - ① skew (panning motion)
- ① varying illumination:
  - ① camera flash
  - ① fluorescent lamps



Slowed down to 2Hz



# Hardware fixes

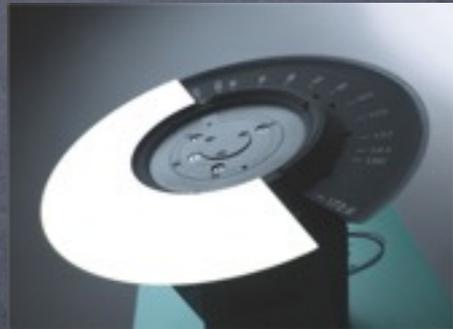
- Mechanical shutters
- Good for still images
- Used only in motion-picture video cameras (cumbersome)



Sony F65 Cinealta  
CMOS motion-picture camera

# Hardware fixes

- Mechanical shutters
- Good for still images
- Used only in motion-picture video cameras (cumbersome)



Rotating mirror shutter  
from ALEXA



Sony F65 Cinealta  
CMOS motion-picture camera

# Hardware fixes

- Mechanical image stabilization
- **Assumption:** Small camera rotations
- **Solution:** Tilt lens/move sensor to counteract motion
- **Failure cases:**



Camera pan



Image plane rotation



Object motion

# Hardware fixes

- Steadicam rigs, dollies and rails
- **Failure cases:** same as for MIS.

+ also generates smooth trajectories

- cumbersome



Steadycam smoothee  
for cellphones

# Naming controversy

- Some authors use the term **CMOS distortion** or **CMOS motion distortion** instead of rolling shutter
- Some even (incorrectly) use the term **motion blur**
- We prefer the term **rolling shutter** because:
  - The problem is not confined to CMOS sensors
  - There are global shutter CMOS sensors

# Focal-plane shutters

- Slow focal-plane shutters also cause rolling-shutter artifacts
- The fastest focal-plane shutters have rates near 0.1 msec/frame.



Grand Prix de Circuit de la Seine', June 26th 1912,  
photographed by Jacques Henri Lartigue

# Early TV cameras

- Vidicon

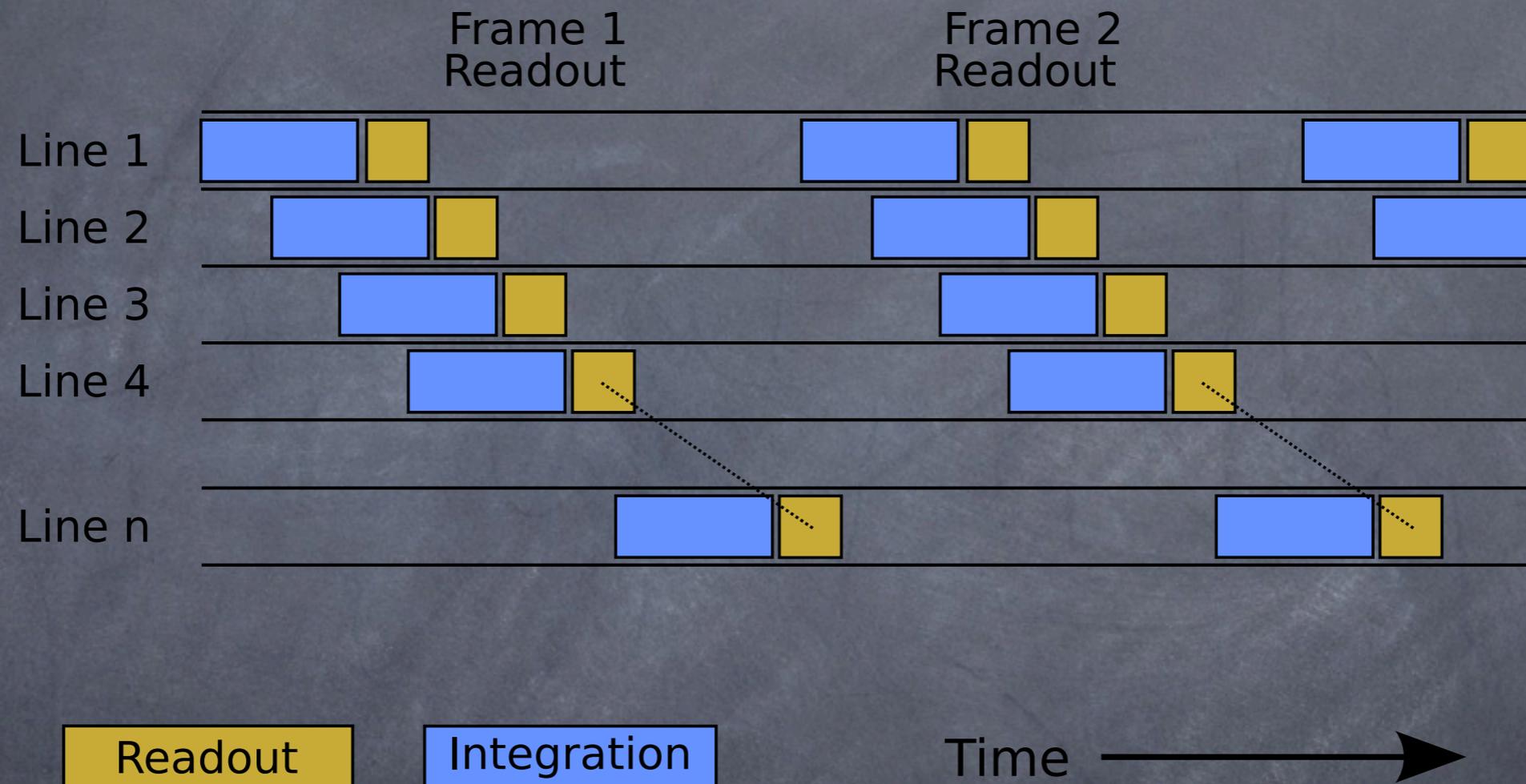


- Used line scanning (thus rolling shutters) of the live scene to generate the serially transmitted TV signal (NTSC or PAL)

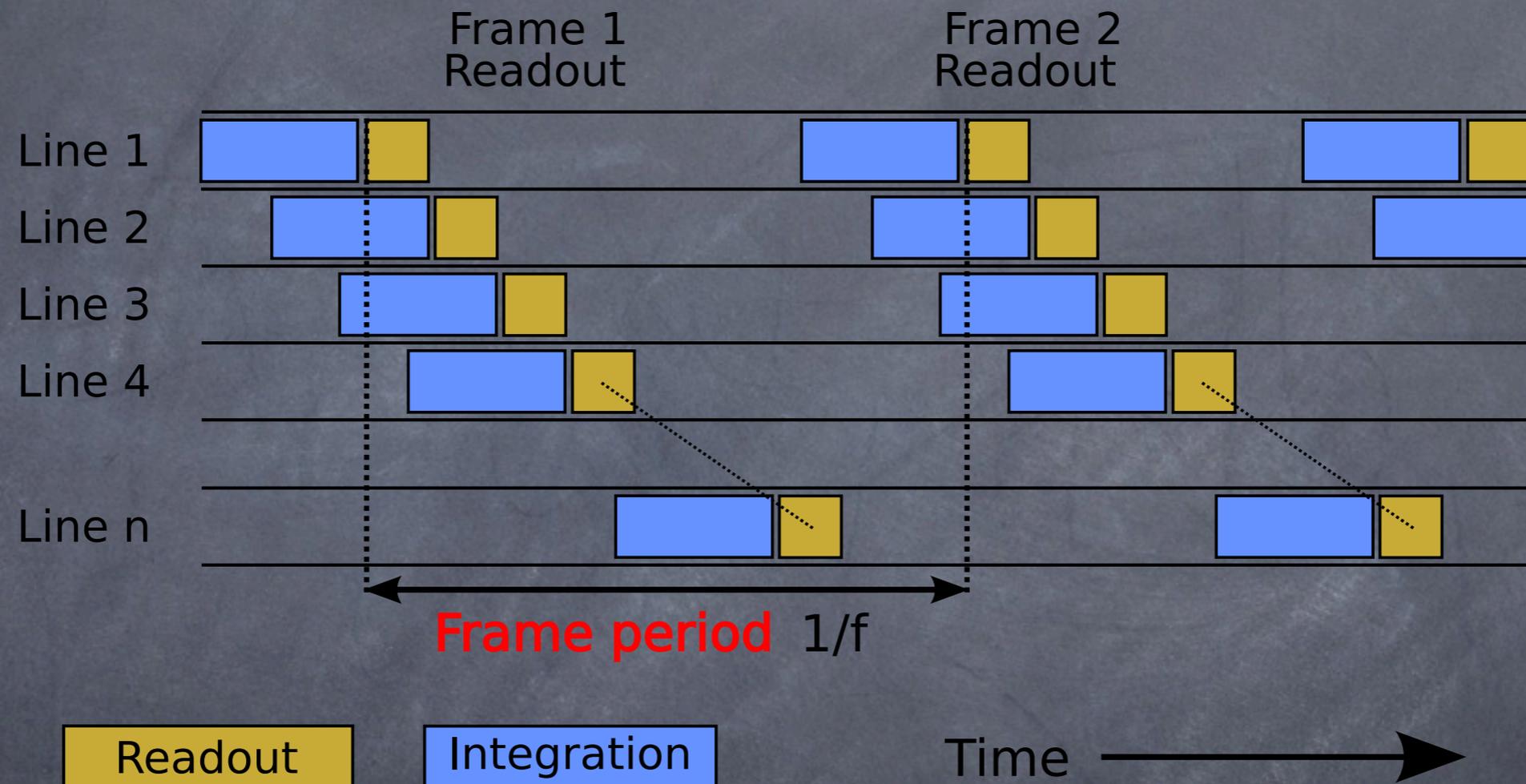
# Sensor readout times

- How fast are modern rolling shutters?
- sensor readout times (milliseconds)

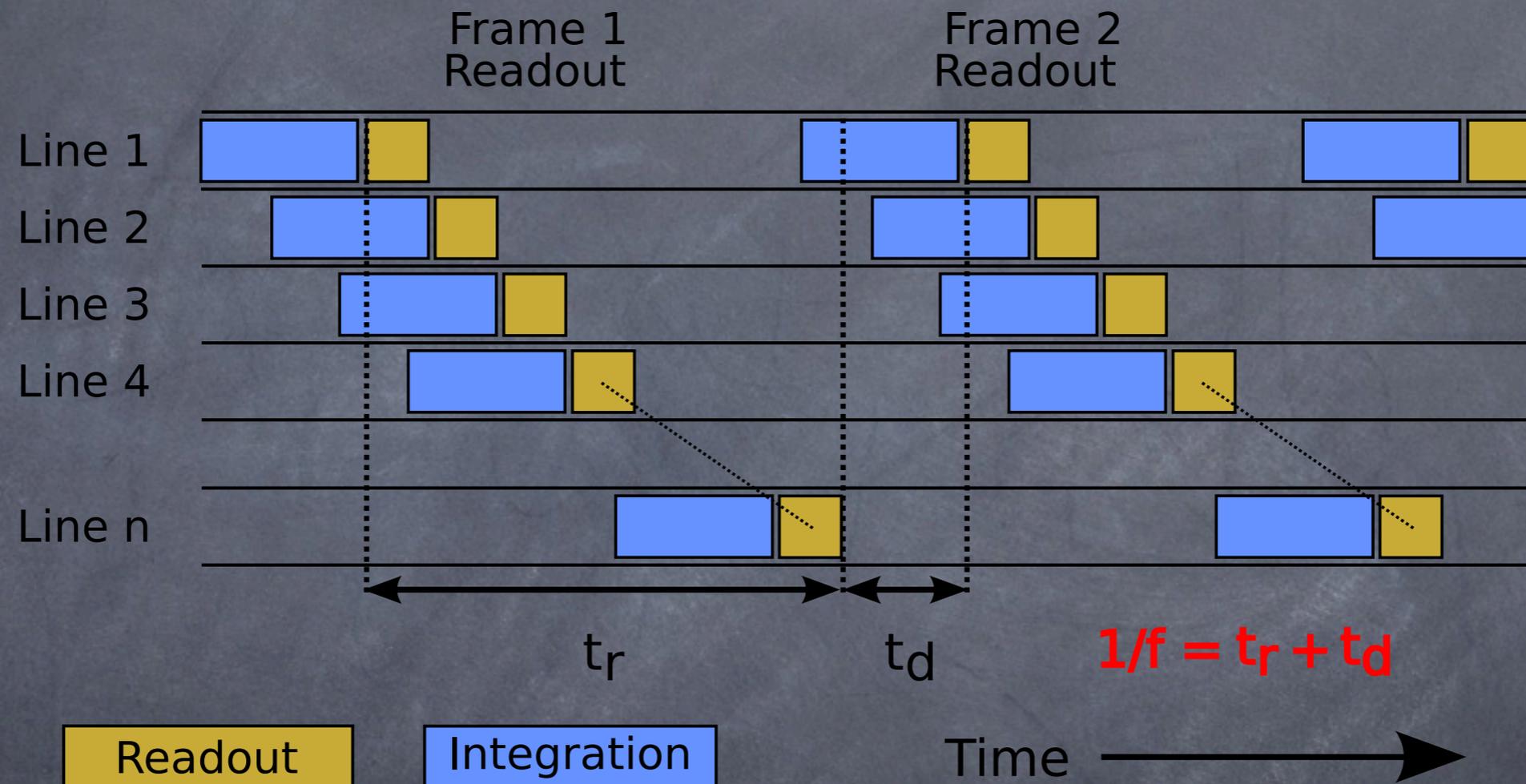
# Sensor readout times



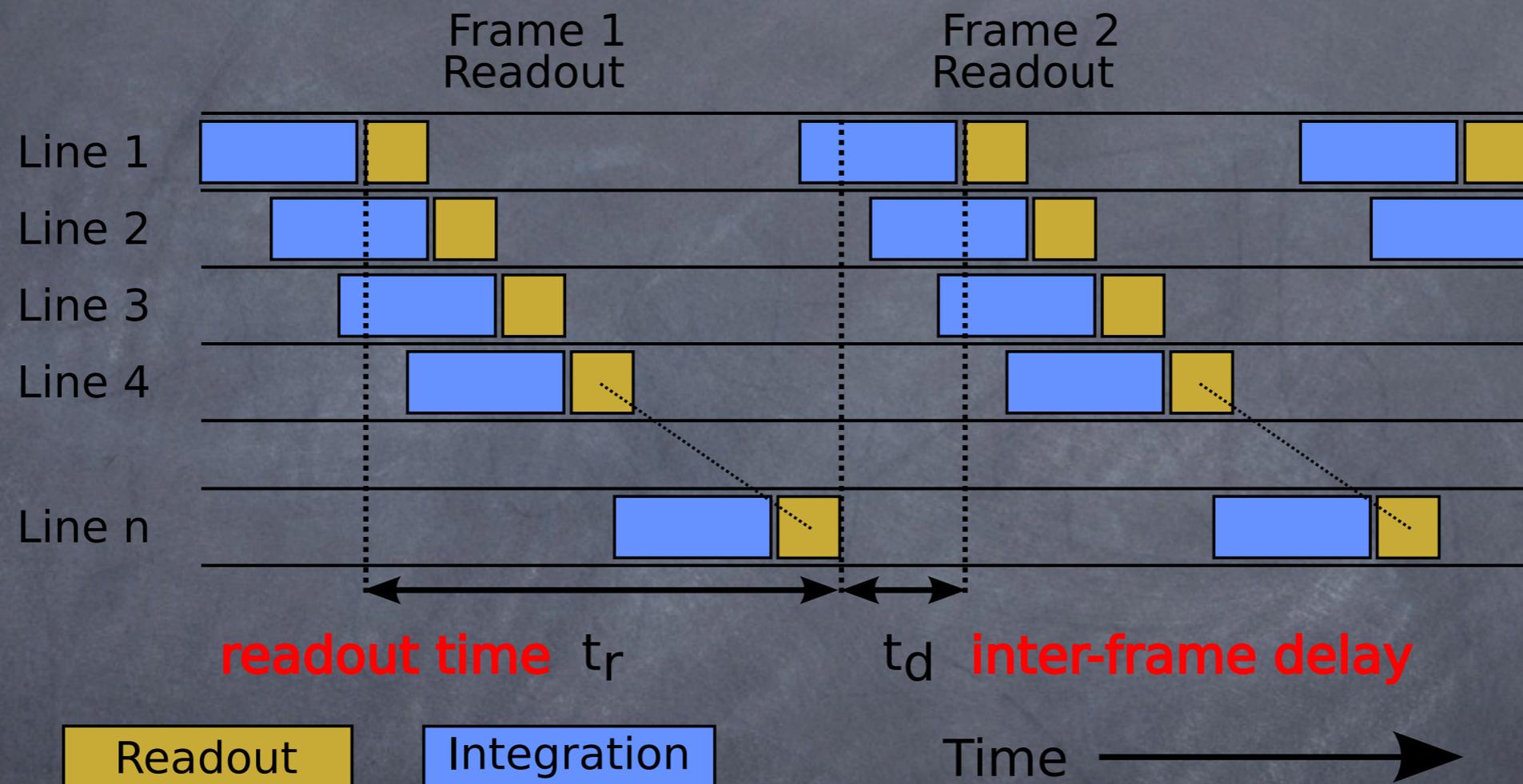
# Sensor readout times



# Sensor readout times

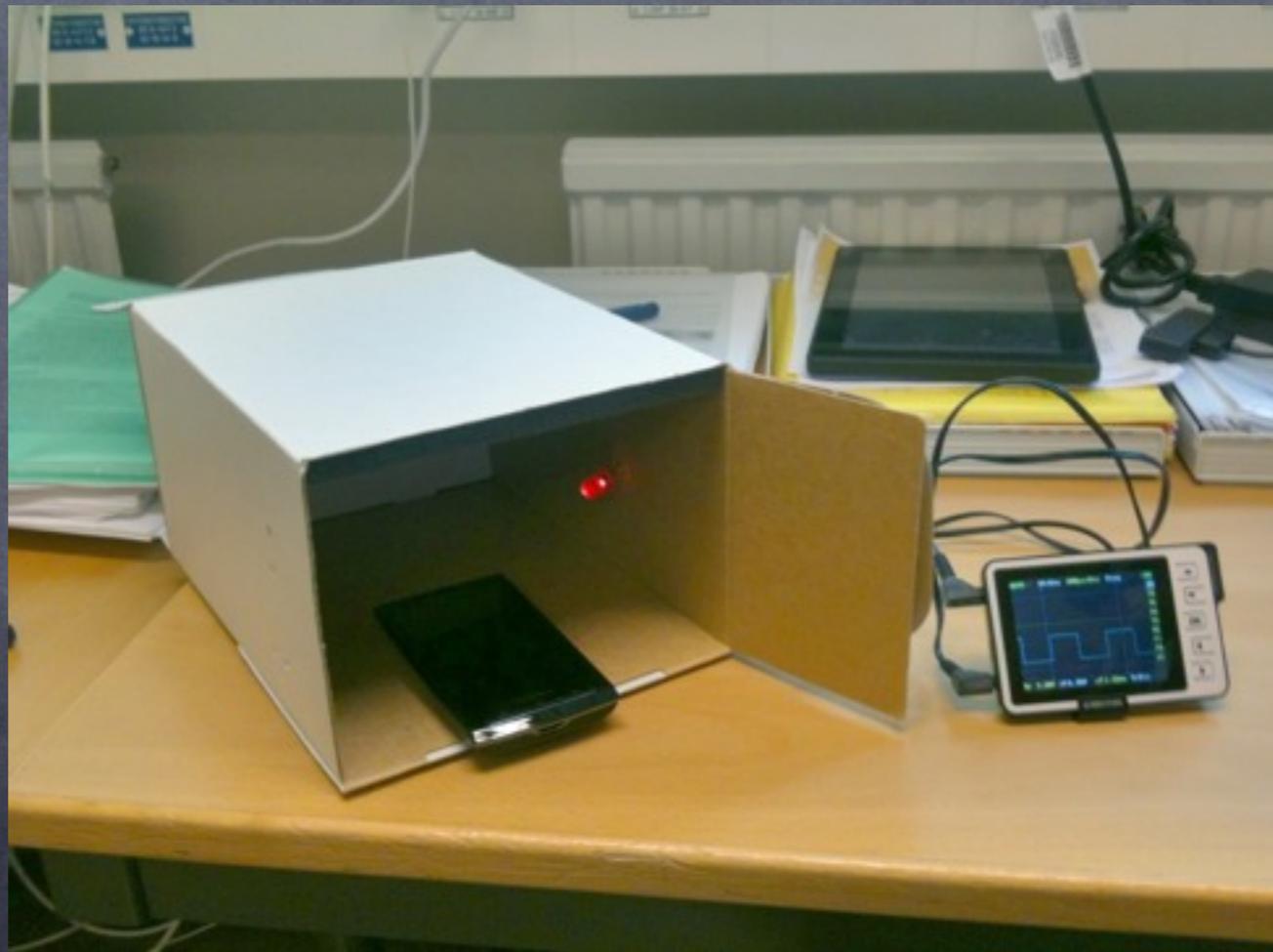


# Sensor readout times



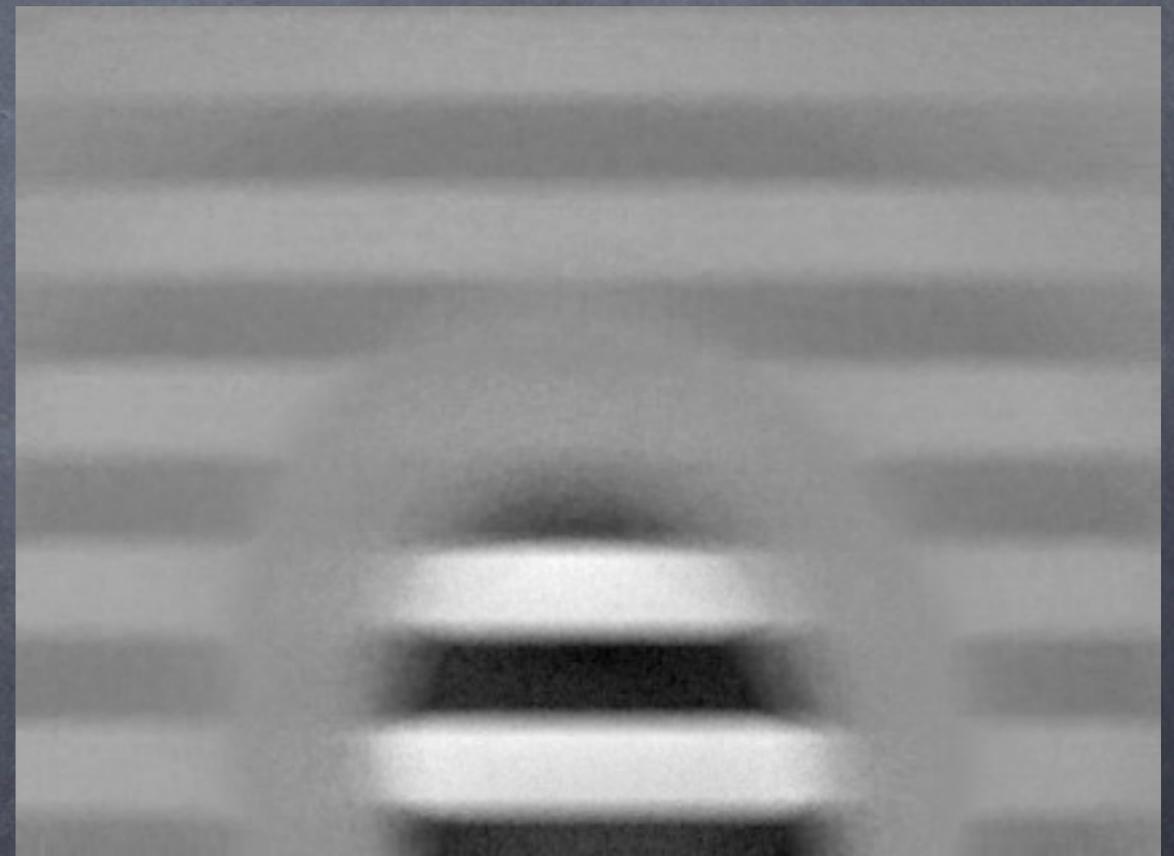
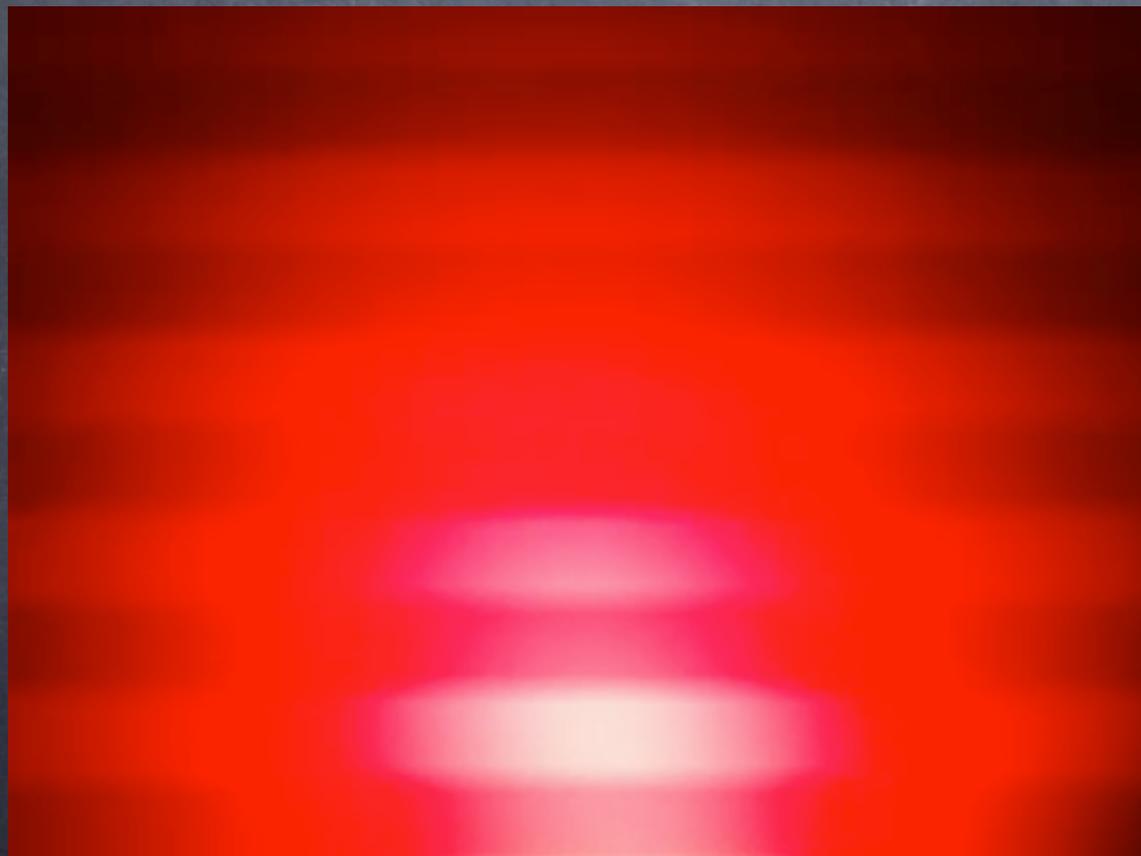
# Sensor readout times

- We obtain the readout time as  $t_r = N_r / (T f_o)$  by imaging a flashing LED with known frequency  $f_o$  and measuring the imaged period  $T$  [Geyer et al. OmniVis 2005]



# Sensor readout times

- We obtain the readout time as  $t_r = N_r / (T f_o)$  by imaging a flashing LED with known frequency  $f_o$  and measuring the imaged period  $T$  [Ringaby & Forssén IJCV 2012]



# Sensor readout times

Device	framerate	Released	readout
GoProHD Hero	59.94fps	Fall 2009	16.22 msec
Kinect RGB	30fps	Nov 2010	26.11 msec
Kinect NIR	29.97fps	Nov 2010	30.55 msec
iPhone 4s	30fps	Oct 2011	22.08 msec
AR drone v2	30fps	June 2012	24 msec



# Summary

- Rolling shutter cameras are everywhere
- CMOS image sensors designed for the mass market have electronic rolling shutter (ERS) readout
- A rolling shutter degrades all kinds of geometric computer vision
- A mechanical shutter solves the RS problem
- The readout time can be measured accurately by imaging a flashing light with known rate.