



# Outdoor Inspection of PV Modules Using Drone-based Electroluminescence Imaging

# Outline

- **Motivation**
  - Electroluminescence imaging:
    - High accuracy
    - Fast acquisition
    - Less weather constraints
  - Drones:
    - Speed
    - Automation
- **Drone-based EL**
  - Nighttime and dusk-dawn
  - Daytime – Challenges
    - Signal Enhancement
  - Prototype and results
- **Conclusions and Outlook**





# PV Inspections: Fast and Accurate



- Power and material integrity
- Warranted ~0,5% degradation rate per year
- Some faults impact the energy production:
  - Linearly with time
  - Exponentially with time
- Important to consider:
  - Product variations
  - Climate
  - Mounting configuration
  - Etc.

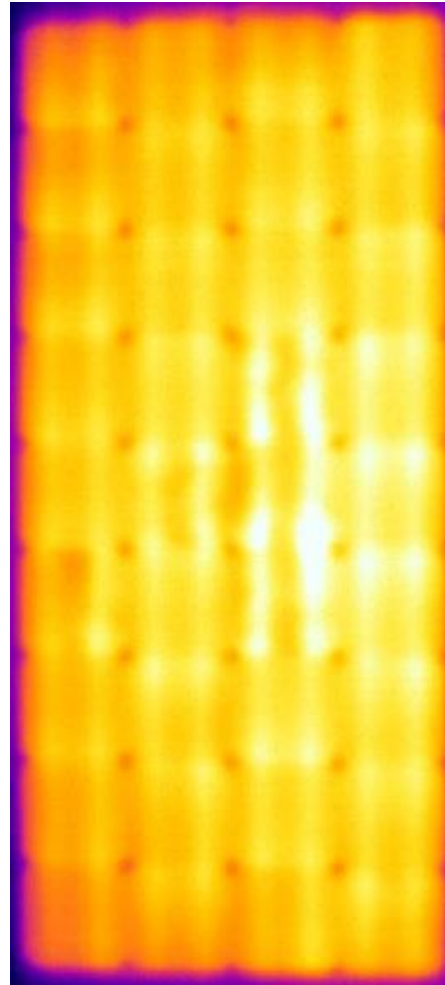
**How to pinpoint failures?**

**How to define their severity?**

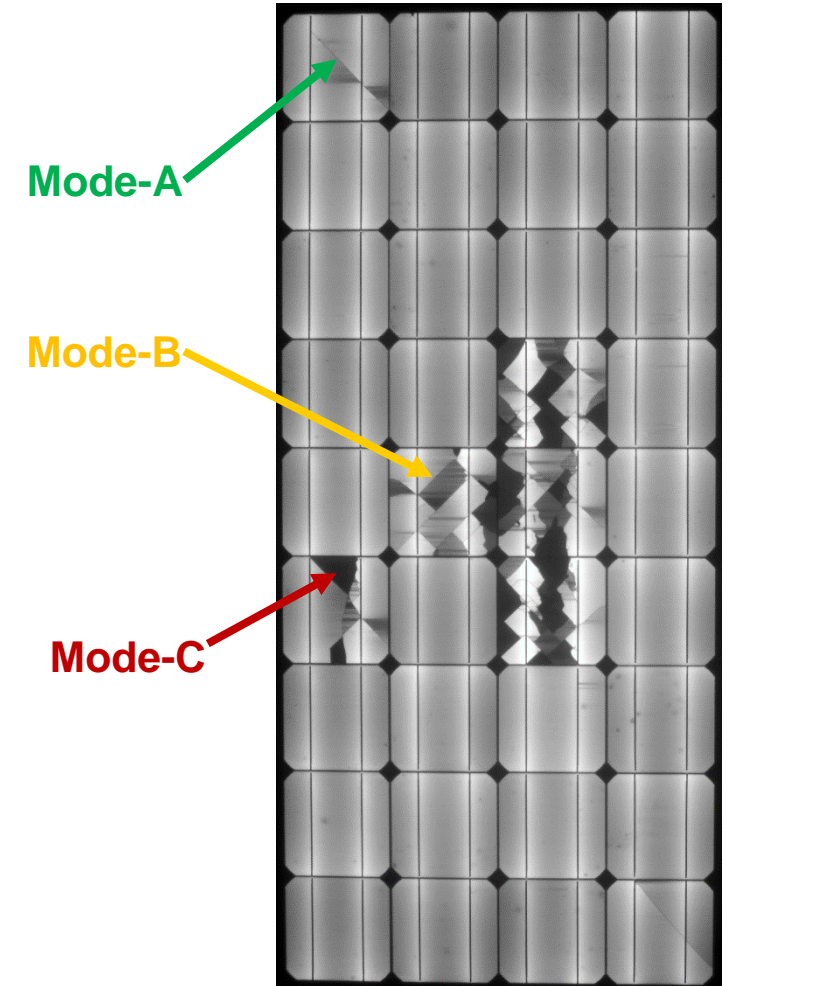
# Inspection Techniques Comparison



**Visual**



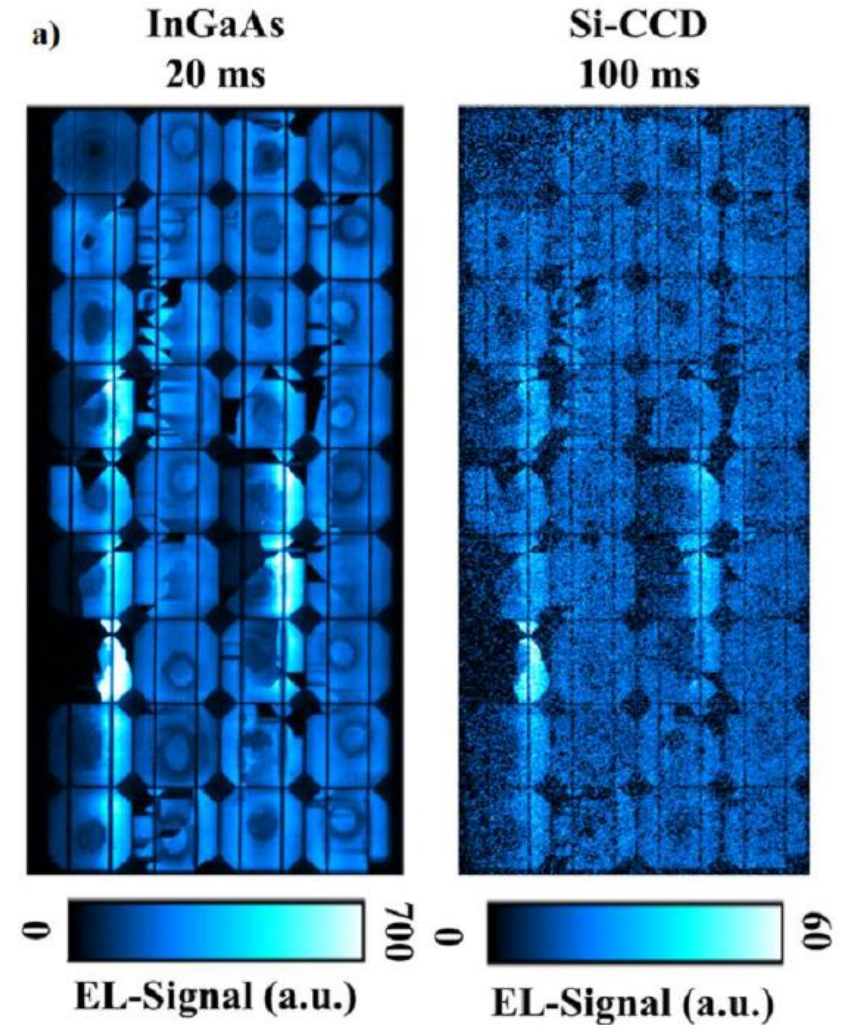
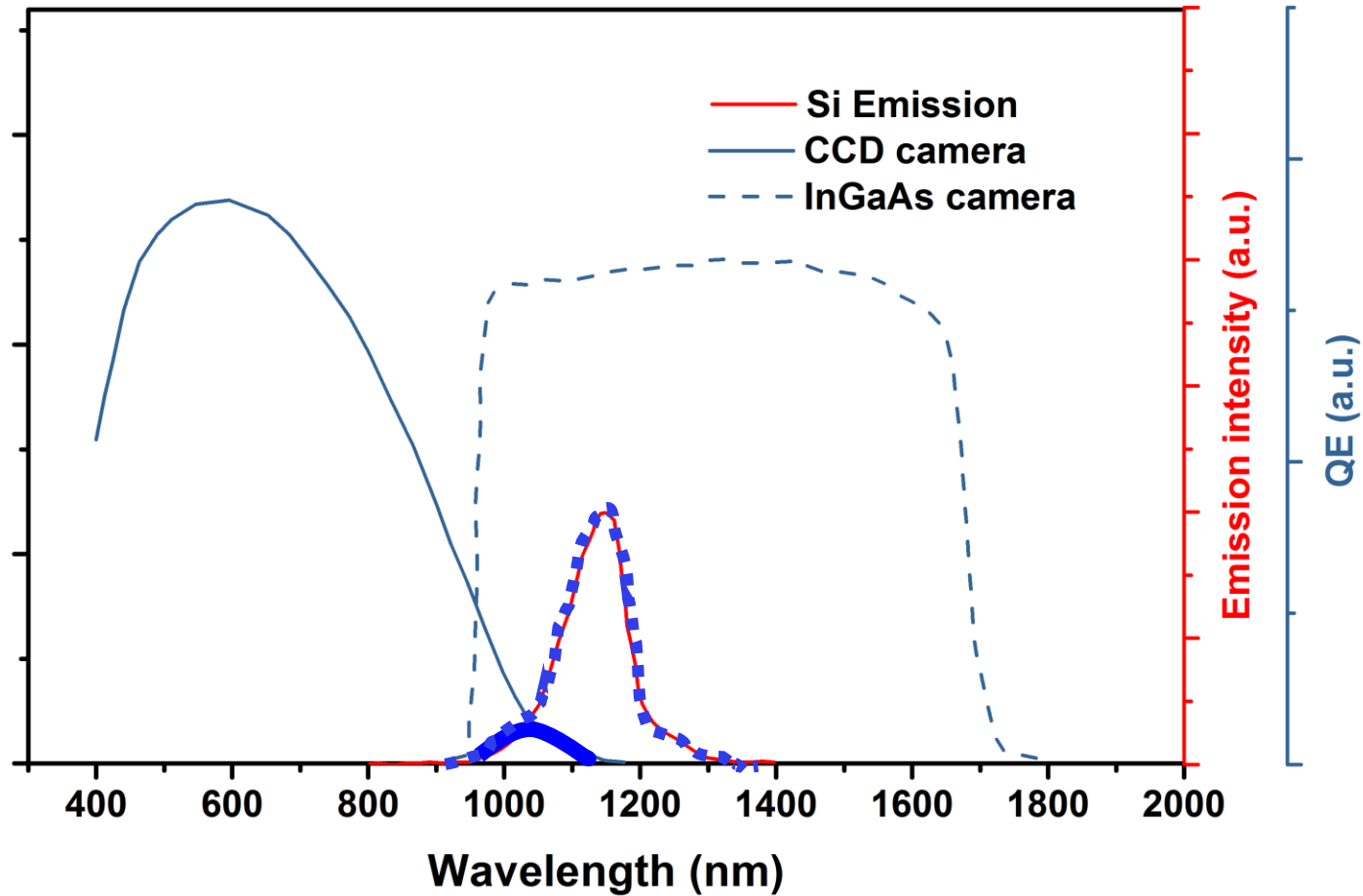
**IR Thermography (IRT)**



**Electroluminescence (EL)**

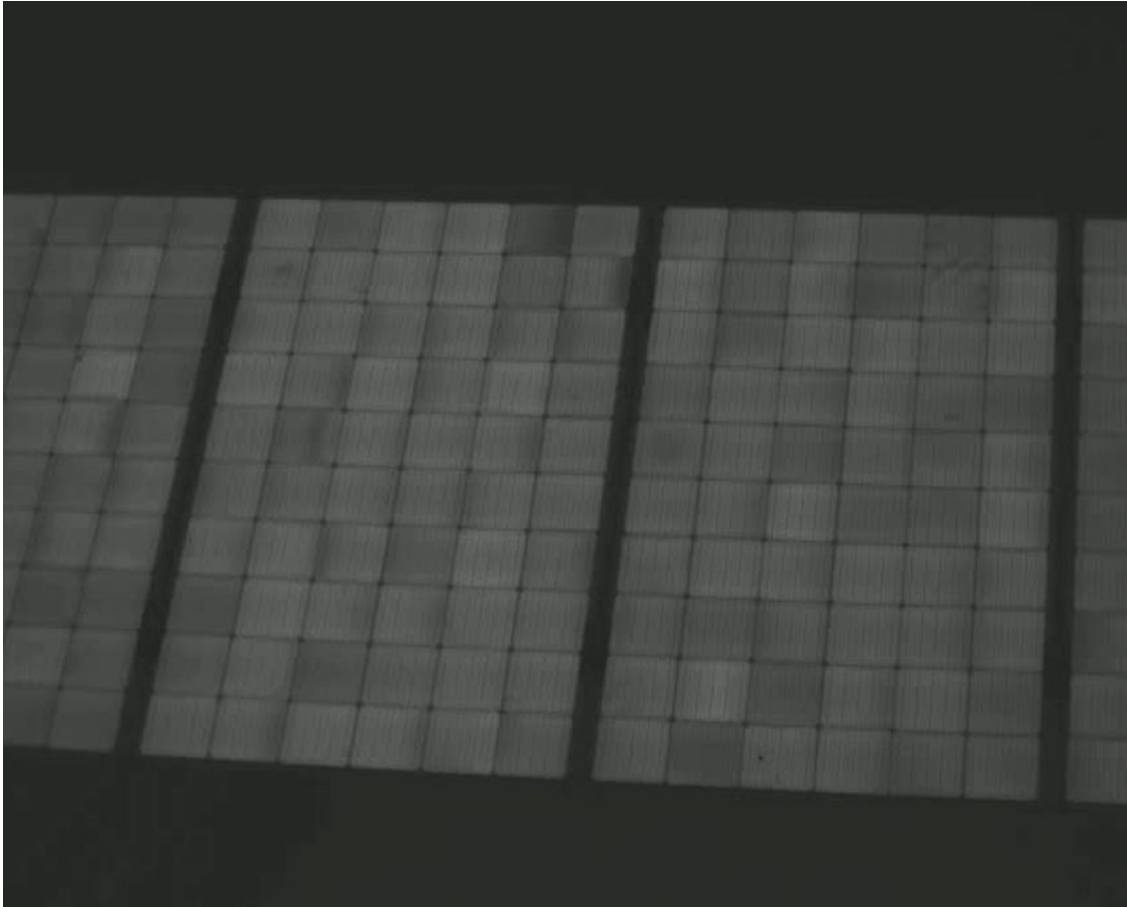


# Si photon emission - Detectors



Adams, J., et. Al. 32nd European Photovoltaic Solar Energy Conference and Exhibition, 2016.

# Drone-based EL – Nighttime & Dusk-Dawn

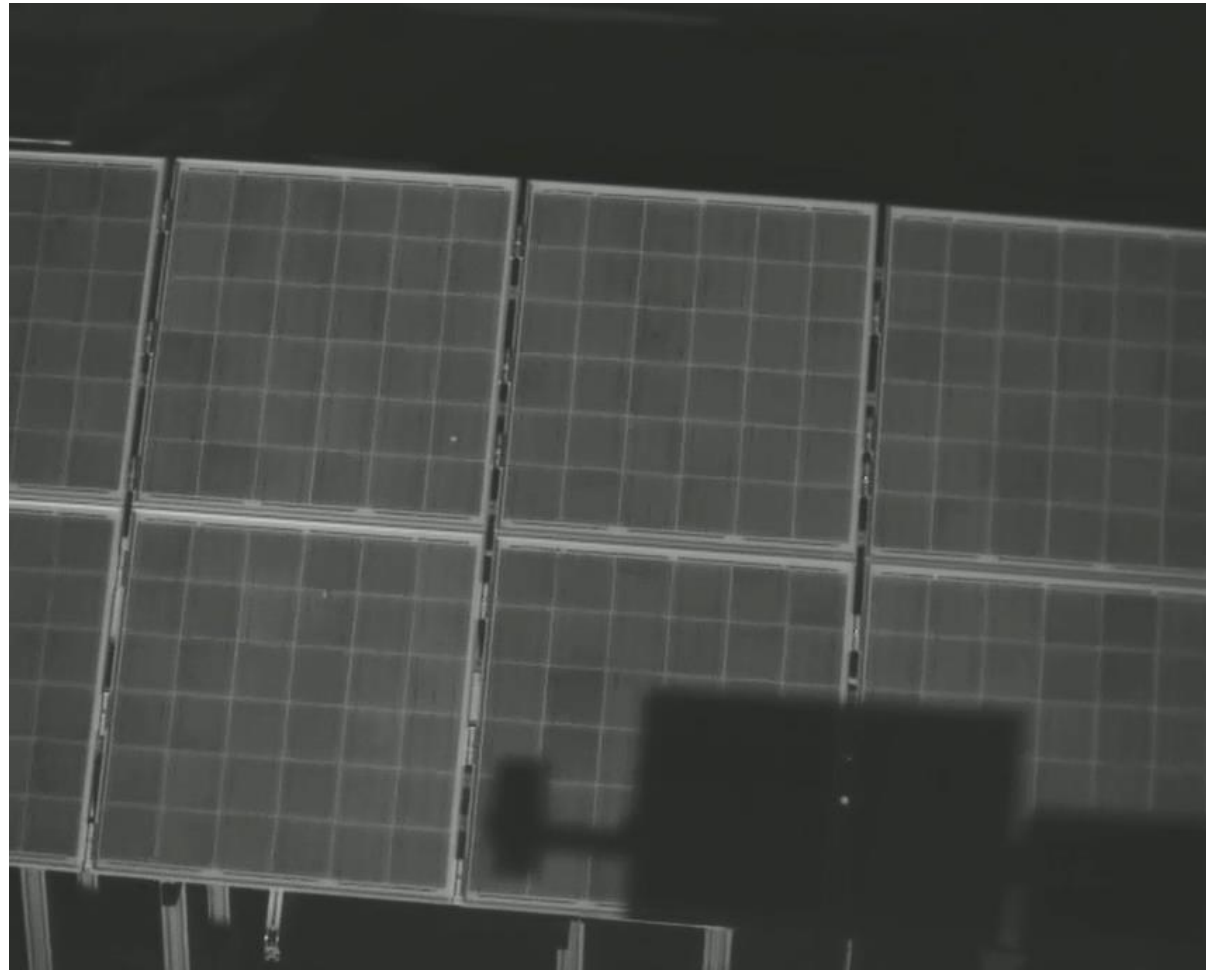


**Night time**



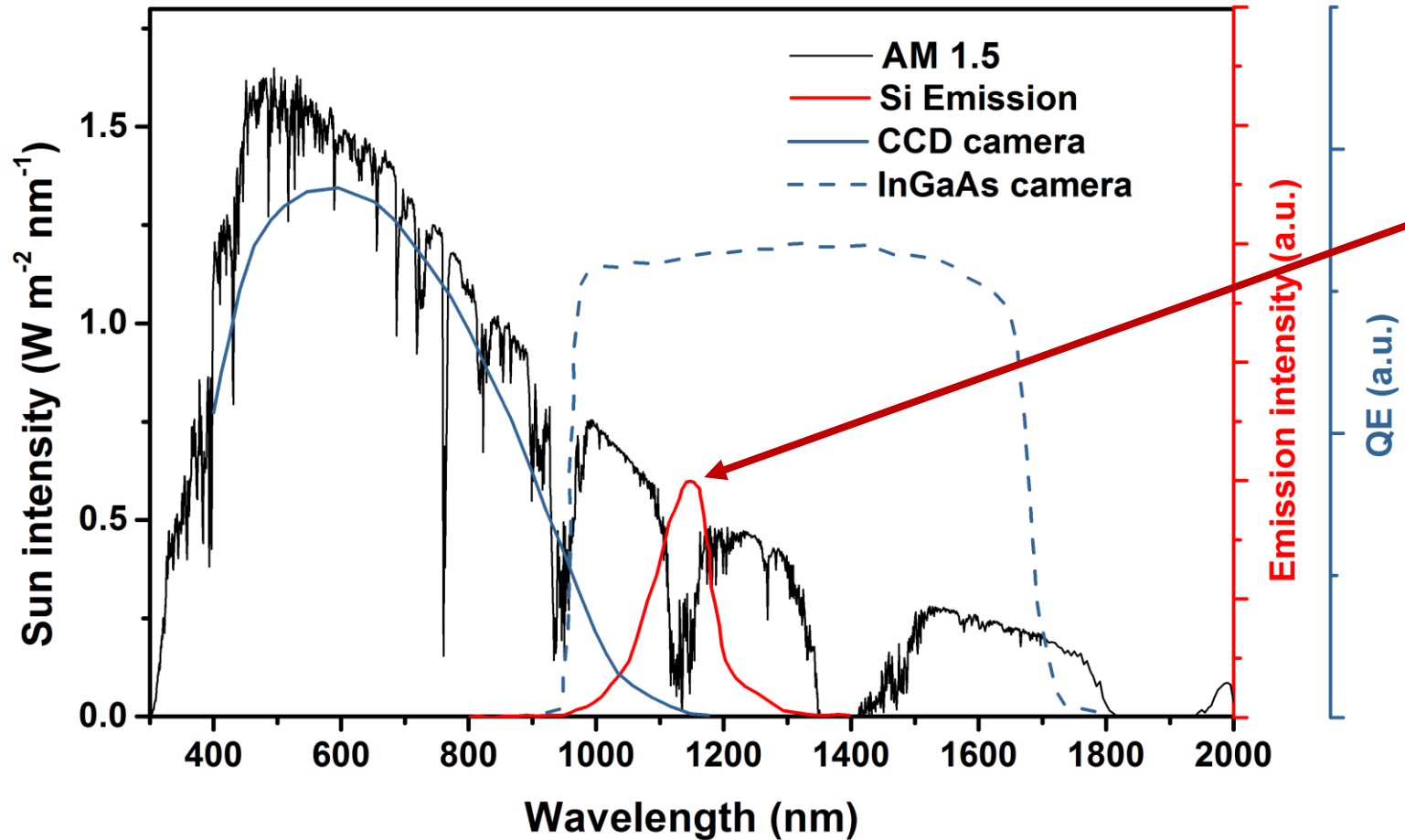
**Before sunrise**

# Drone-based EL – Daytime



**Daytime**

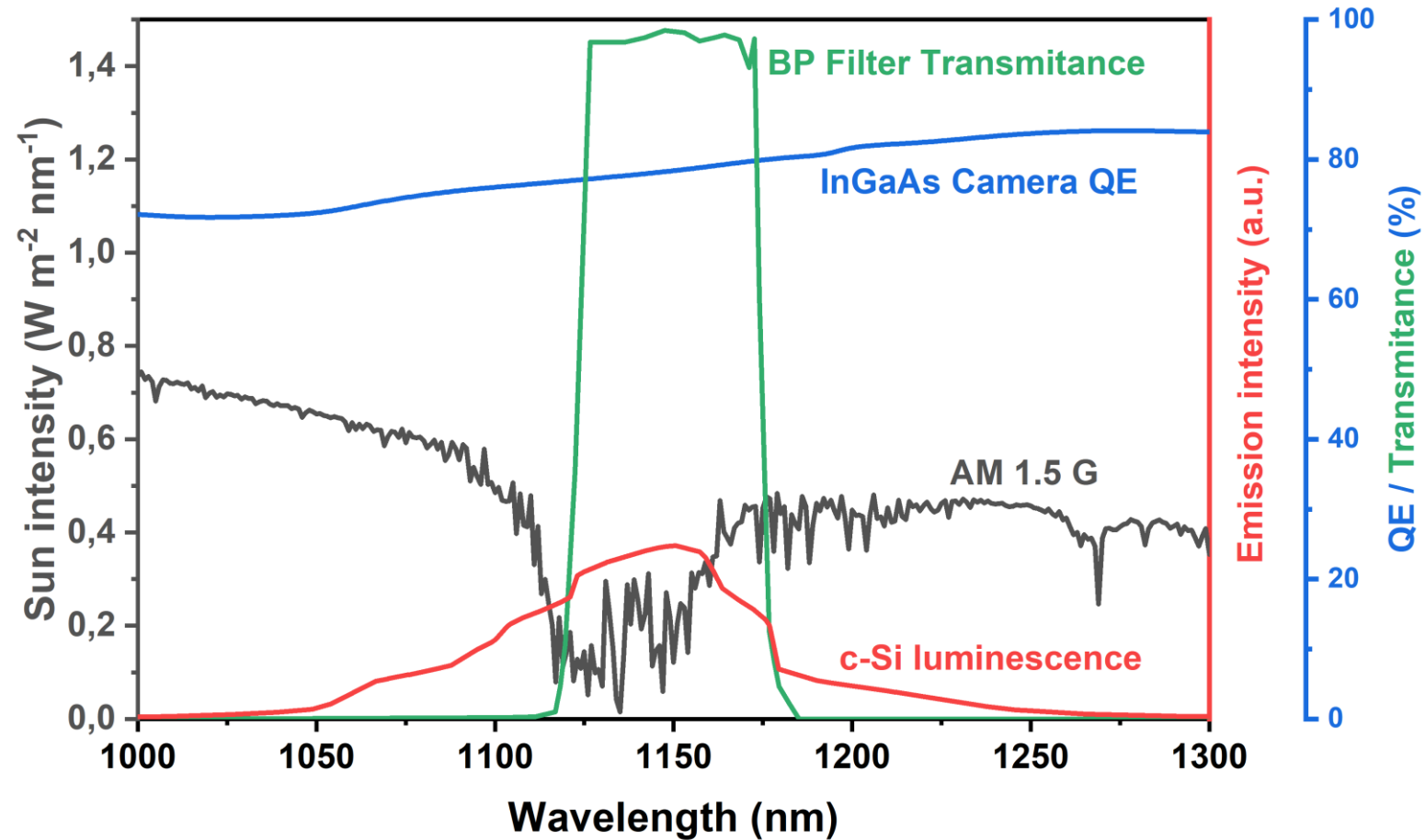
# Daylight EL – Challenges



**4-5  
Orders of  
Magnitude  
less intense!**



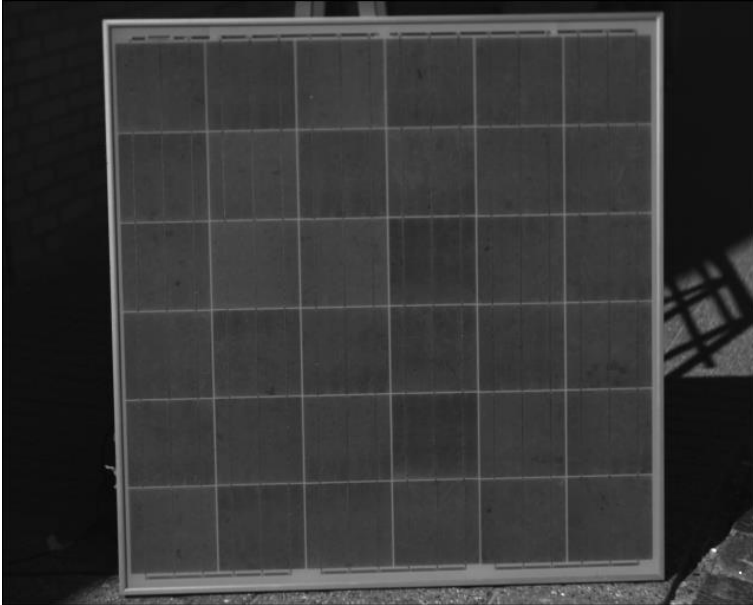
# Daylight Filter



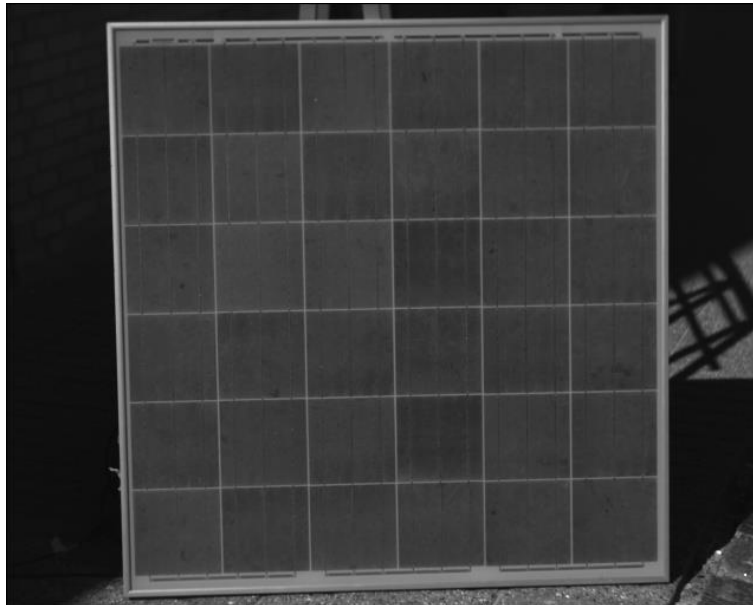
G. Alves dos Reis Benatto et al., IEEE J. Photovoltaics, vol. 10, no. 3, pp. 1–6, 2020.

# Background Subtraction

EL image

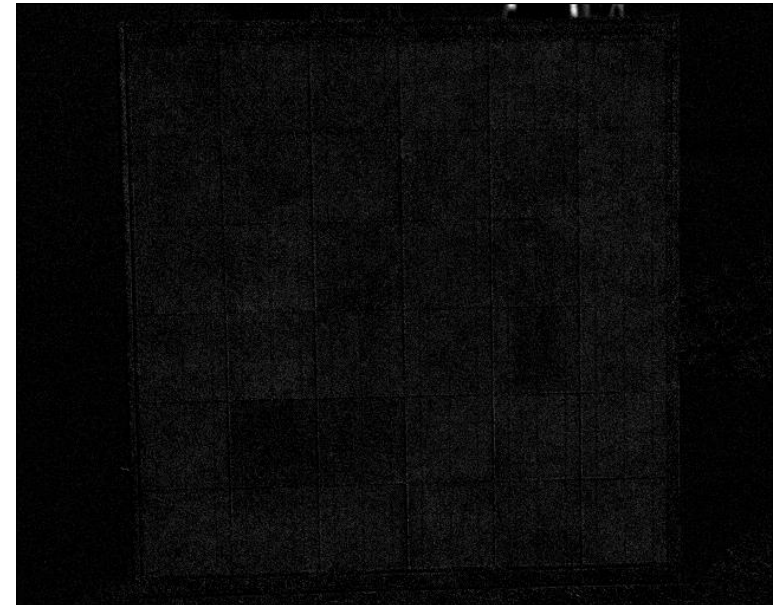


BG image



-

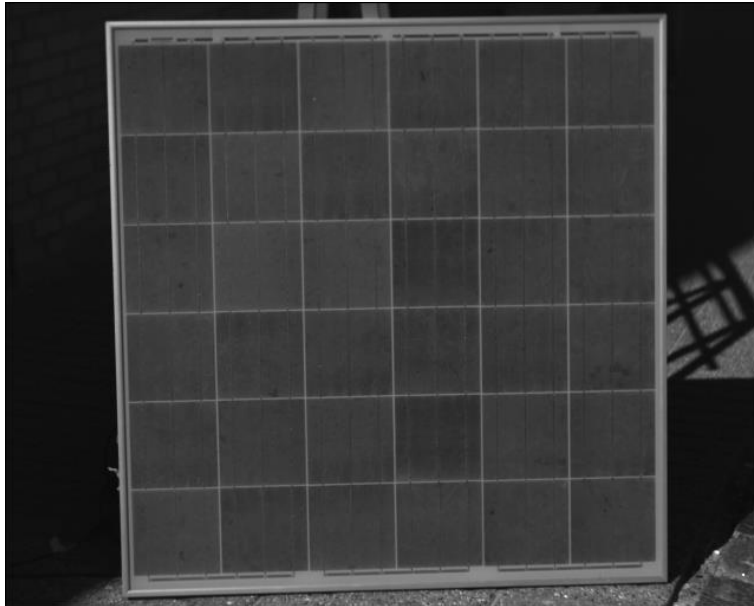
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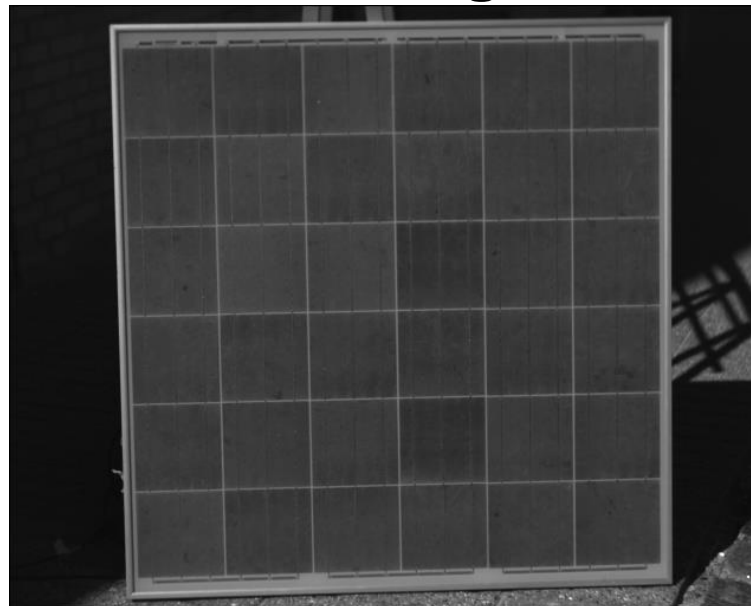
G. Alves dos Reis Benatto, 2020.

# Background Subtraction

EL image

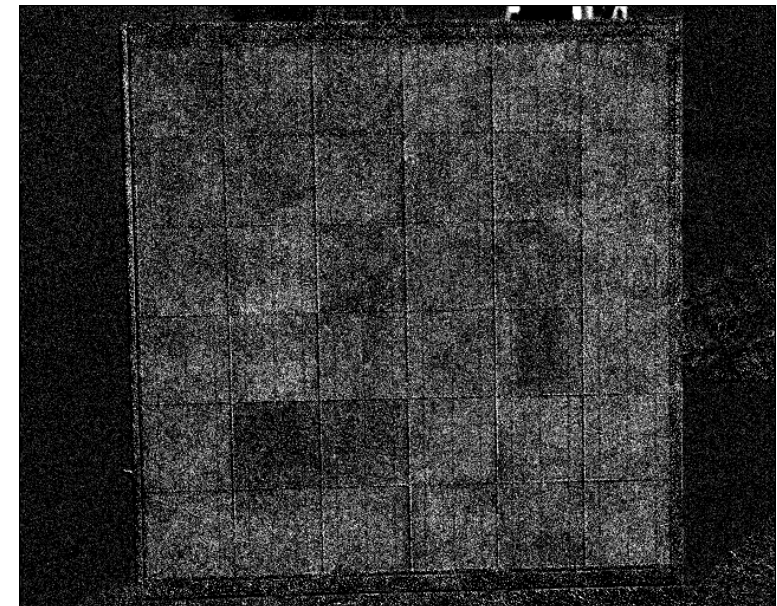


BG image



-

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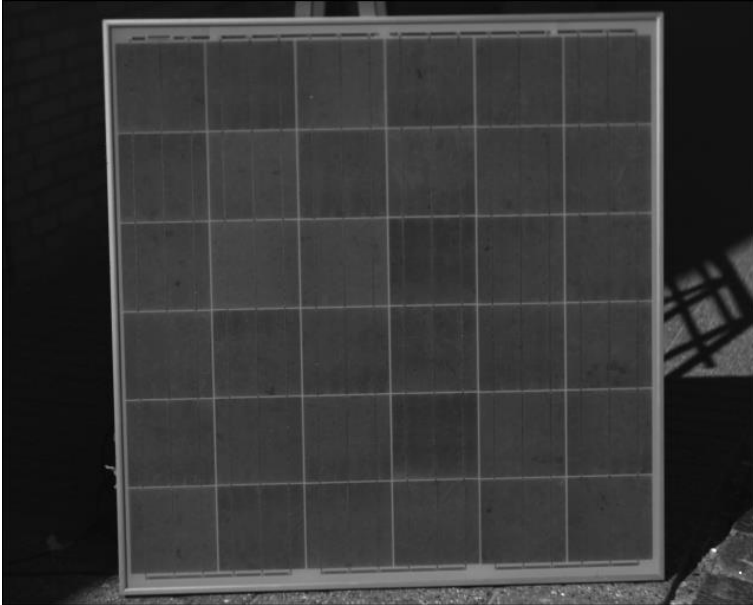


G. Alves dos Reis Benatto, 2020.

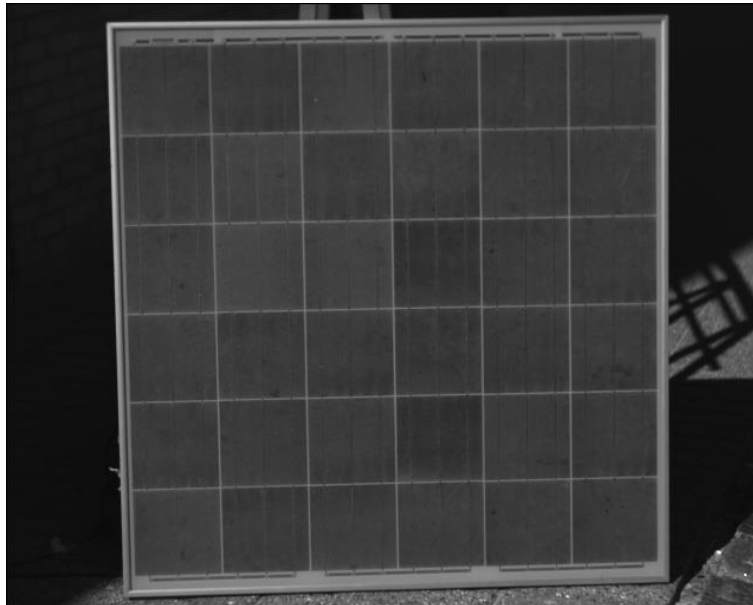


# Averaging and Background Subtraction

**Averaged EL images**

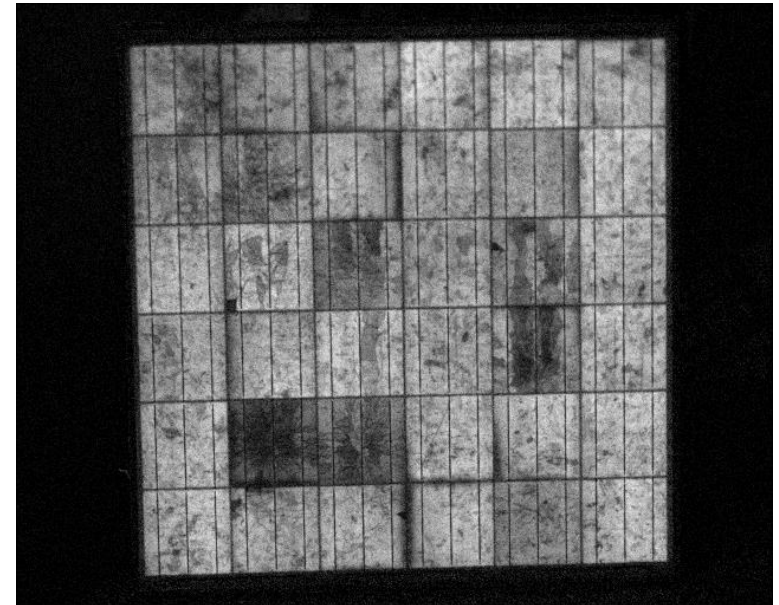


**Averages BG images**



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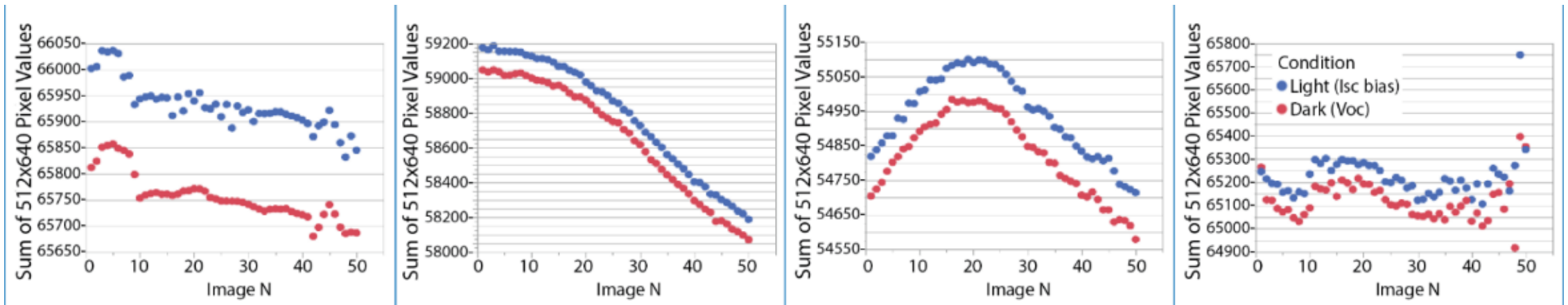
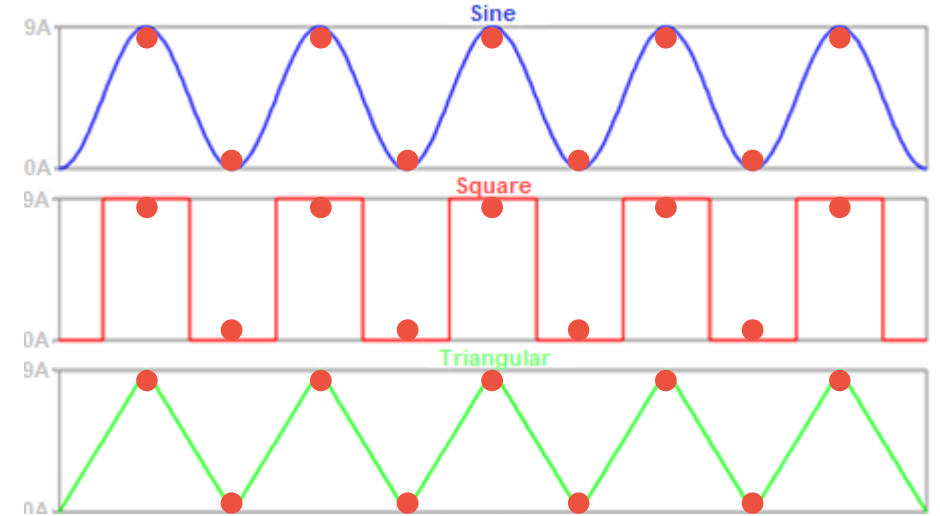
**Daylight EL**



G. Alves dos Reis Benatto, 2020.

# Modulated Image Acquisition

- **Sequence of EL and images following a waveform:**
  - Framerate = 2 x modulation frequency
  - Required to overcome irradiance variations
- **Statistical difference between EL and BG images**



G. A. dos Reis Benatto *et al.*, 44th IEEE Photovolt. Spec. Conf., 2017.

# SNR Quality Criteria

- **Indoors EL  $\Rightarrow$   $SNR_{50} > 45$**
- **Outdoors EL  $\Rightarrow$   $SNR_{50} > 5$**

$$SNR_{50} = \frac{\sum_k \left( 0.5 \cdot (EL_1(k) + EL_2(k)) - BG(k) \right)}{\sum_k (|EL_1(k) - EL_2(k)| \cdot K)}$$

- **$SNR_{50}$  for INDIVIDUAL images:**

- $EL_1 = 1$  "Light" image
- $EL_2 = 1$  "Light" image
- $BG = 1$  "Dark" image

$$SNR_{AVG} = \frac{\sum_k \left( avg_{i \in N_1} (EL_i(k) - BG_i(k)) \right)}{\sum_k \left( \left| avg_{i \in N_1} (EL_i(k)) - avg_{j \in N_2} (EL_j(k)) \right| \cdot K \right)}$$

- **$SNR_{AVG}$  for AVERAGED images:**

- $EL_i =$  Average of  $N_1$  "Light" images
- $EL_j =$  Average of  $N_2$  "Light" images
- $BG =$  Average of  $N$  "Dark" images

$$K = \sqrt{0.5} \cdot \left( \frac{2}{\pi} \right)^{-0.5}$$

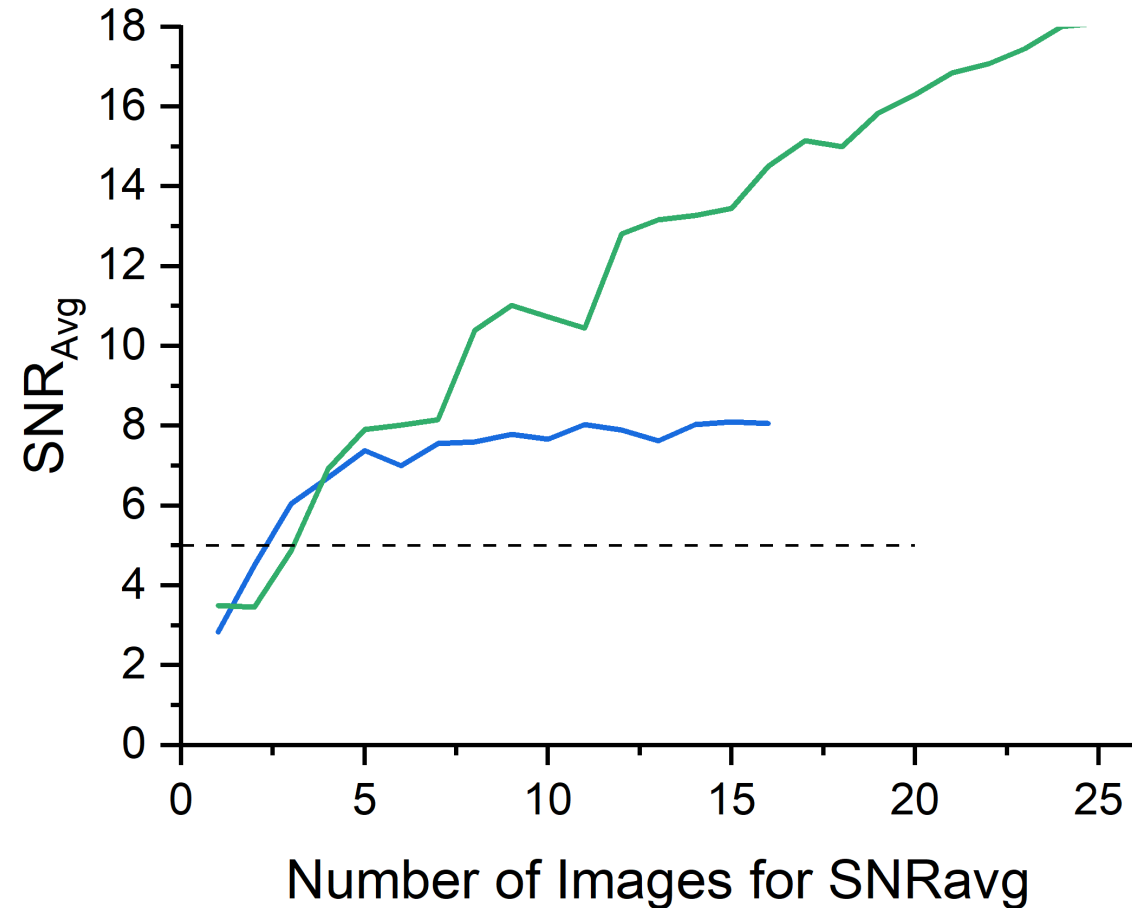
IEC, "IEC TS 60904-13 Photovoltaic Devices - Part 13: Electroluminescence of Photovoltaic Modules," <http://www.iec.ch/>

C. Mantel et al., 7th World Conference on Photovoltaic Energy Conversion (WCPEC) 2018, pp. 3285–3289.



# SNR Quality Criteria

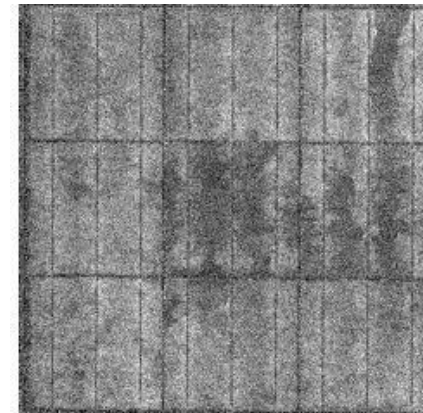
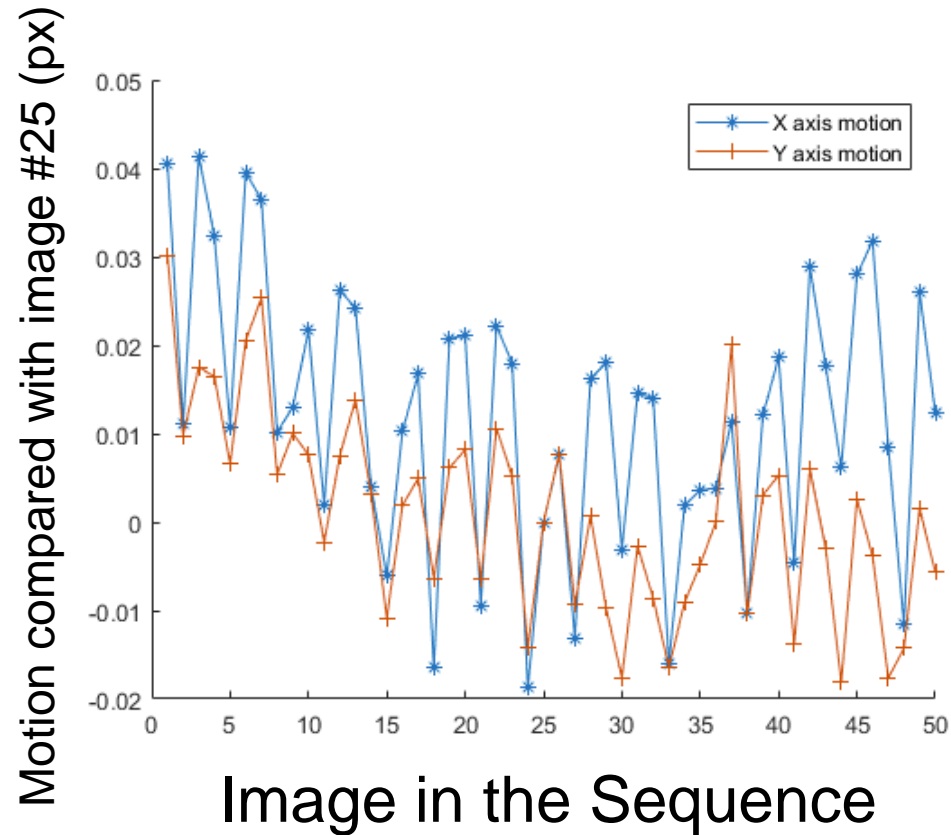
- **Daylight EL – Stationary**
  - $G_{\text{POA}} = 891 \text{ W m}^{-2}$
  - Image sequences acquired one after the other
  - Same modulation frequencies
- **Good quality images, but  $\text{SNR}_{\text{AVG}}$  not always adds up in quality**



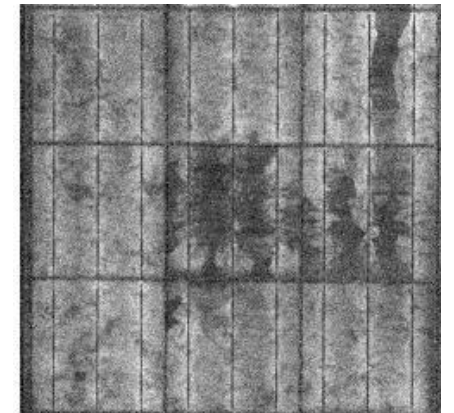
G. Alves dos Reis Benatto, 2020.

# Motion between frames

- Main factor that prevents image quality enhancement



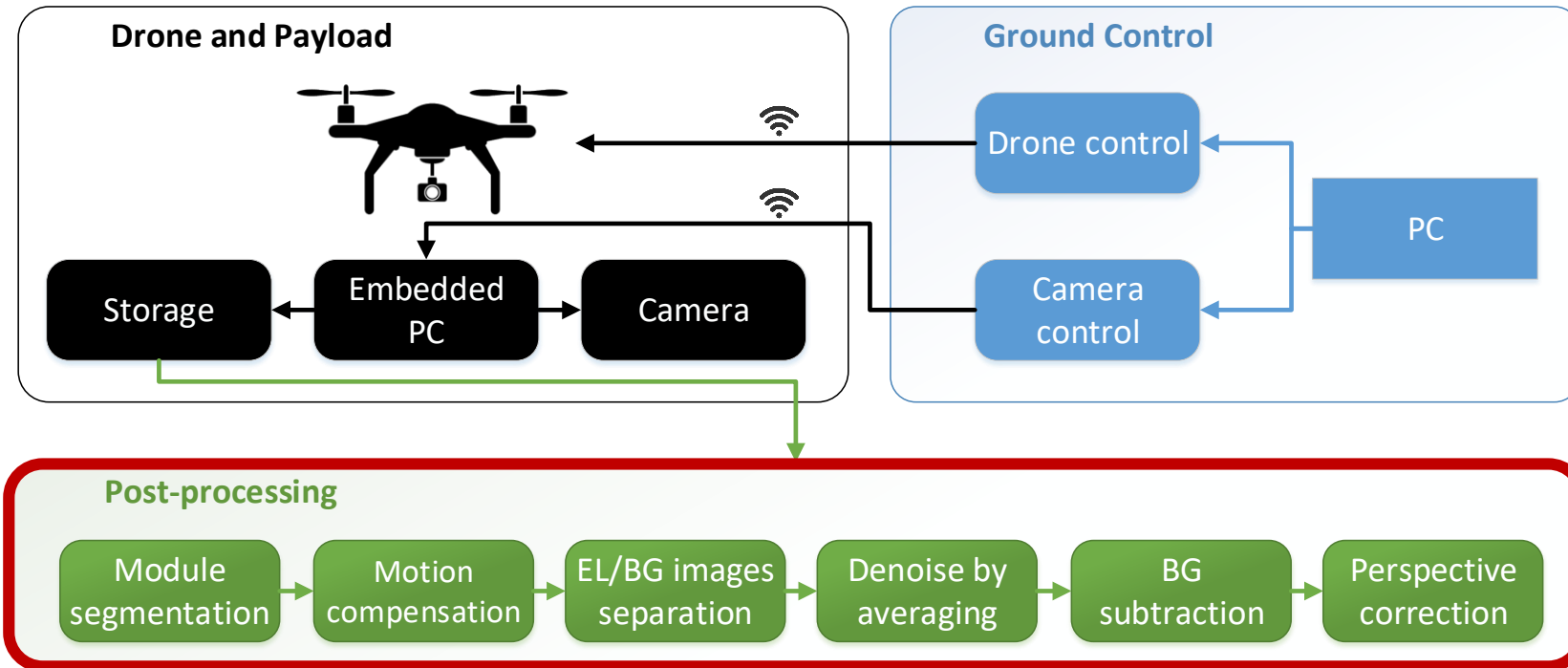
**Without shake selection**



**With shake selection**

C. Mantel et al., 2018 IEEE 7th World Conference on Photovoltaic Energy Conversion, WCPEC 2018, pp. 3285–3289.

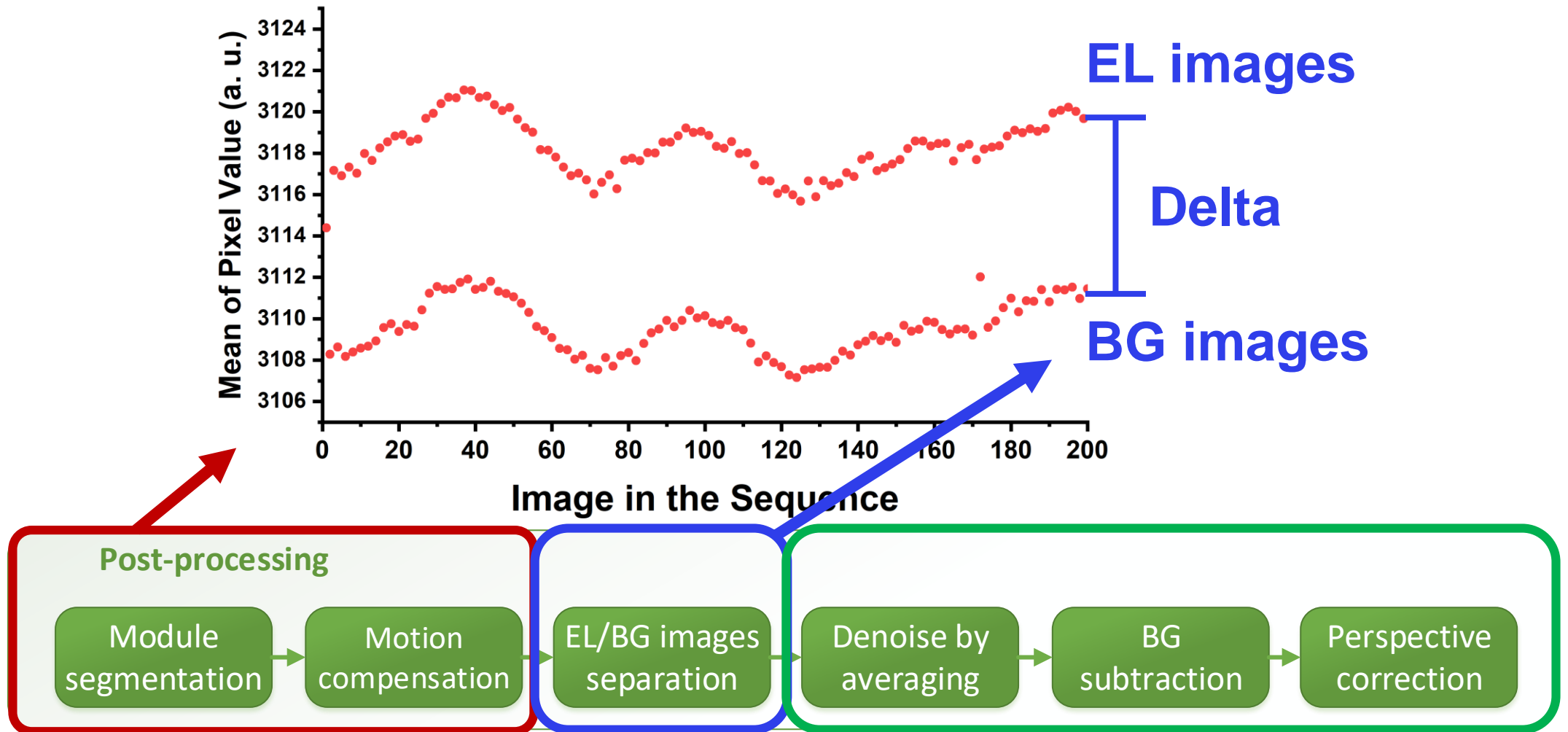
# Image Acquisition System



G. Alves dos Reis Benatto et al., IEEE J. Photovoltaics, vol. 10, no. 3, pp. 1–6, 2020.

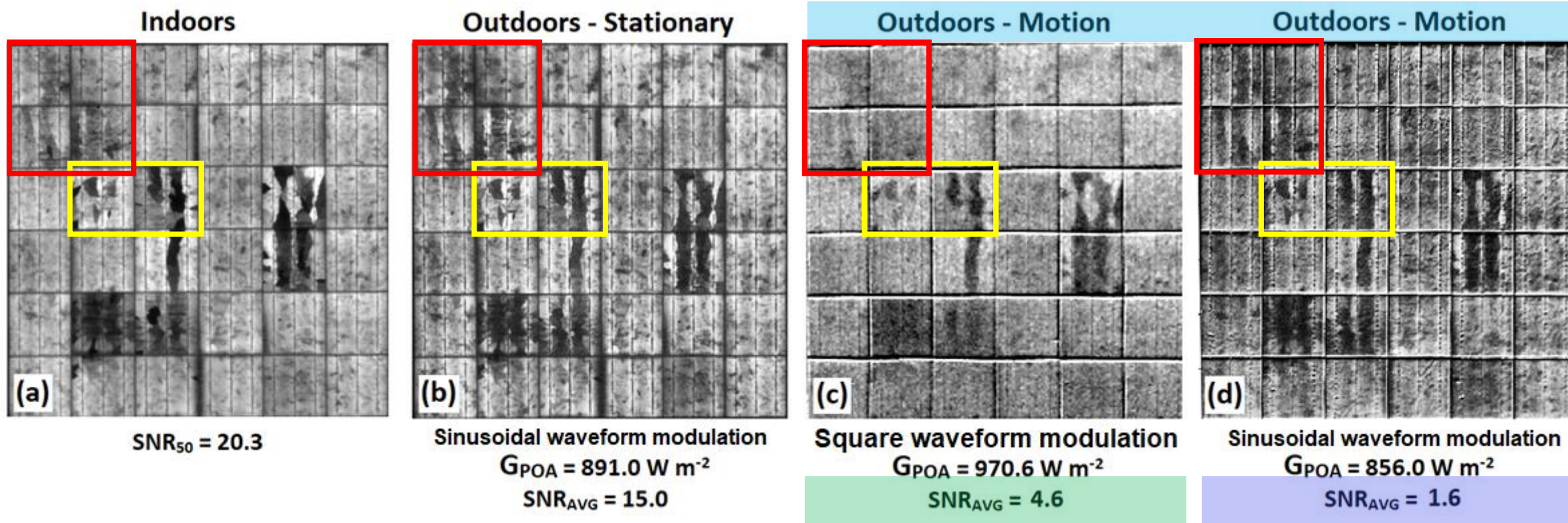


# Image Processing



G. Alves dos Reis Benatto et al., IEEE J. Photovoltaics, vol. 10, no. 3, pp. 1–6, 2020.

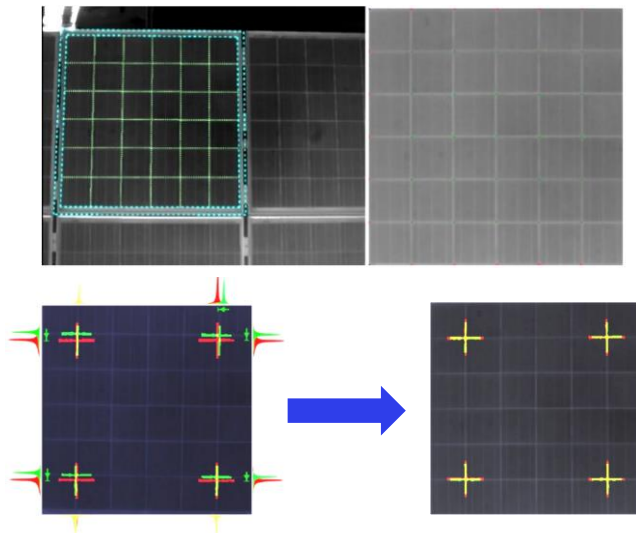
# Resulting EL images



G. Alves dos Reis Benatto et al., IEEE J. Photovoltaics, vol. 10, no. 3, pp. 1–6, 2020.

# Conclusions and Outlook

- **Image quality criteria:** Needs revision for Daylight EL Scenario
- **Many improvements are required for Upscaling Drone-based EL:**
  - Efficient module and signal detection
  - Robust motion compensation
  - Automatic fault detection and severity evaluation



Thøger Kari Hass, Spataru, S., Santamaria Lancia, A. A., Parikh, H., Poulsen, P. B., & dos Reis Benatto, G. A. *37th European Photovoltaic Solar Energy Conference and Exhibition*, 1573–1579, 2020.

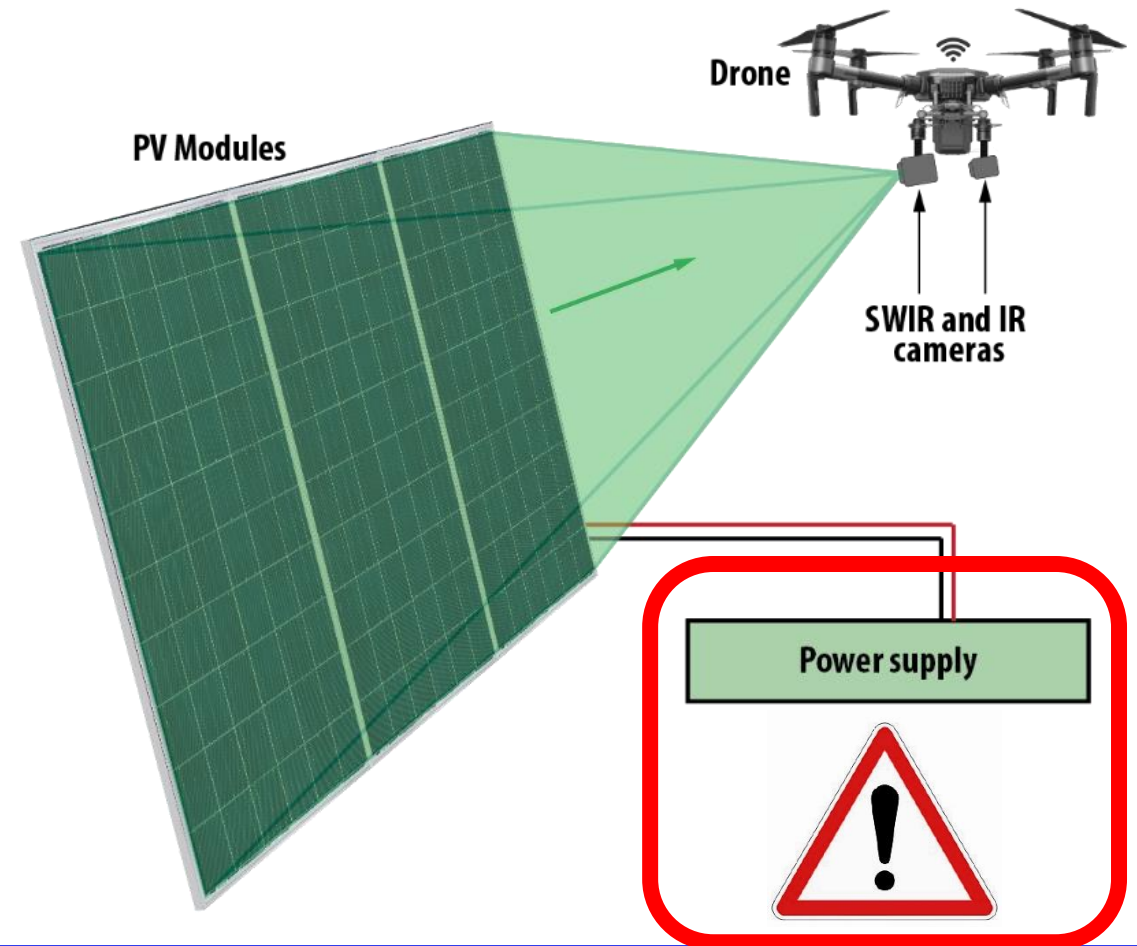
Correct predictions	Actual: Normal Predicted: Normal Vector: V1 Classifier: RF	Actual: Normal Predicted: Normal Vector: V1 Classifier: RF	Actual: Normal Predicted: Normal Vector: V1 Classifier: k-NN	Actual: Finger failure Predicted: Failure Vector: V1 Classifier: SVM	Actual: Crack A Predicted: Crack A Vector: V1 Classifier: RF	Actual: Crack B Predicted: Crack B Vector: V1 Classifier: k-NN	Actual: Crack C Predicted: Crack C Vector: V1 Classifier: k-NN
Wrong predictions	Actual: Normal Predicted: Crack C Vector: V1 Classifier: SVM	Actual: Finger failure Predicted: Normal Vector: V1 Classifier: SVM	Actual: Normal Predicted: Crack C Vector: V1 Classifier: SVM	Actual: Normal Predicted: Crack B Vector: V1 Classifier: k-NN	Actual: Normal Predicted: Crack C Vector: V1 Classifier: SVM	Actual: Normal Predicted: Crack B Vector: V1 Classifier: k-NN	Actual: Crack A Predicted: Normal Vector: V1 Classifier: RF

Parikh, H. R., Buratti, Y., Spataru, S., Villebro, F., Reis Benatto, G. A. Dos, Poulsen, P. B., Wendlandt, S., Kerekes, T., Sera, D., & Hameiri, Z. *Applied Sciences*, 10(24), 8834, 2020.



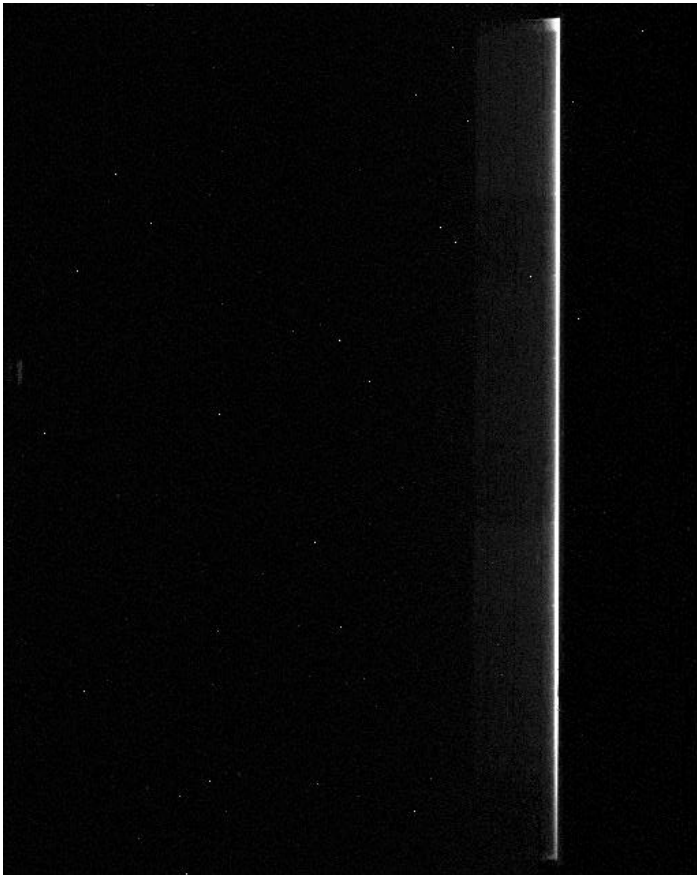
# Outlook

- 80% of EL inspection time is due to electrical connections!

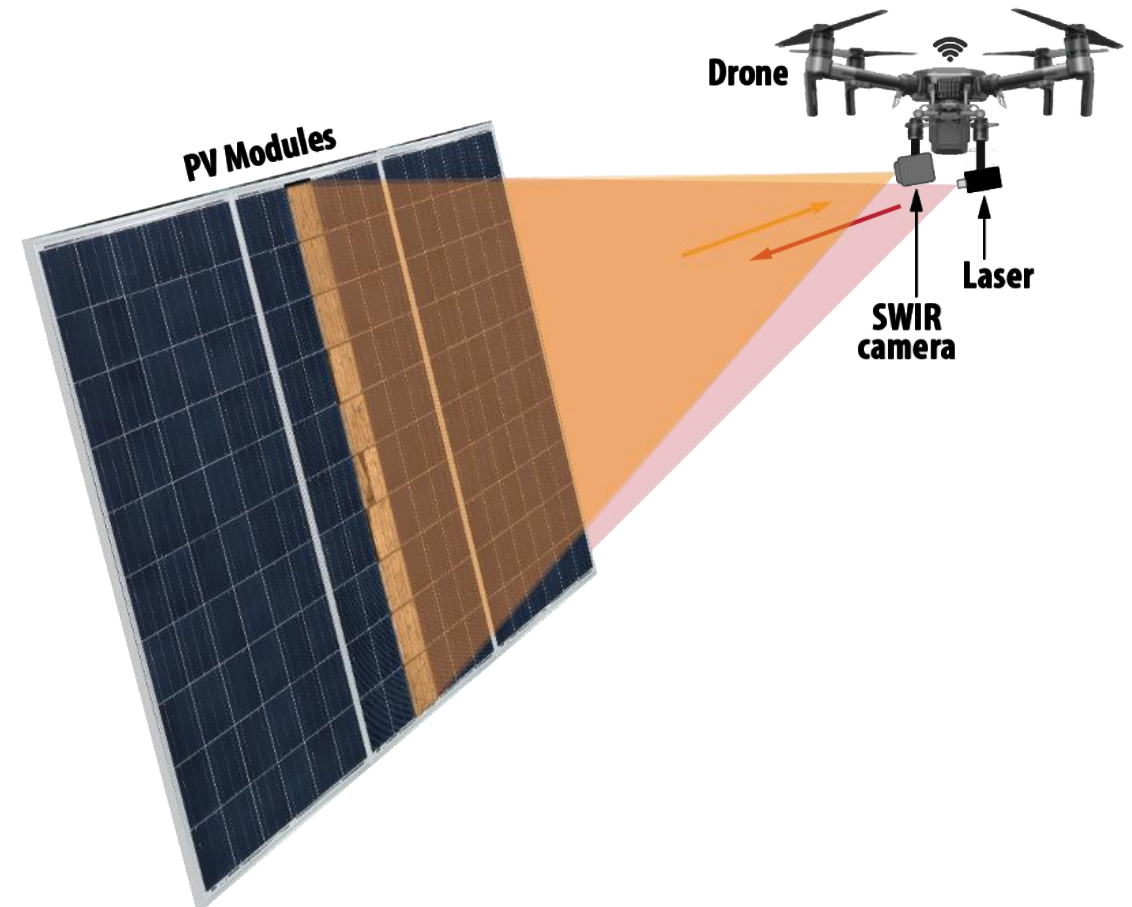


# Outlook

- Laser Induced Luminescence (LIL)



LIL scan



# Thank you for your attention!

## Questions?

