# Aerial Rock Fragmentation Analysis in Low-Light Condition Using UAV Technology

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We use UAV technology to frequently measure rock fragmentation.

In this work we found that:

- Lighting conditions greatly impact photographic analysis accuracy
- Artificial lighting applied evenly can improve prediction accuracy and enable measurement in low light conditions









### 2 Related Work











# Table of Contents

#### Motivation and Problem Statement

### 2 Related Work

## 3 Methods



### 5 Summary





Post-blast rock fragmentation influences:

- Comminution energy consumption
- Mill throughput rates
- Digging and hauling equipment efficiency
- Measuring it is important for optimizing a mining operation.







Unmanned Aerial Vehicle (UAV) technology can measure rock fragmentation:

- Provide higher spatial- and temporal-resolution data
- Automate data collection
- Collect from typically inaccessible and hazardous areas
- Improve safety for technicians
- Frequently measure surface to predict internal distribution





To frequently measure rock fragmentation consider:

- Night shifts in surface mines
- Underground working conditions



However, UAVs equipped with common cameras in poor lighting:

• Difficult to delineate particles





Two questions this work investigates:

- How much does poor lighting effect accuracy?
- Can artificial lighting reduce this effect?







# 2 Related Work

## 3 Methods



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# Related Work

Limitations for photographic and 3D measurement of rock fragmentation:

Limit	Photographic	3D techniques
Measure surface not internal distribution	$\checkmark$	$\checkmark$
Particle delineation error	$\checkmark$	$\checkmark$
Perspective distortion	$\checkmark$	
Inability to meaningfully detect fines	$\checkmark$	



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3D techniques using LIDAR and stereo imaging control some limitations, however:

- Have not enabled automated measurement
- Currently capture from fixed locations
- Addition to UAV can be expensive





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#### 5 Summary





Compare UAV rock fragmentation measurement using commercial image analysis software with sieve analysis in different lighting conditions for:

- Controlled lab environment
- Outdoor Experiment





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# 2 Related Work









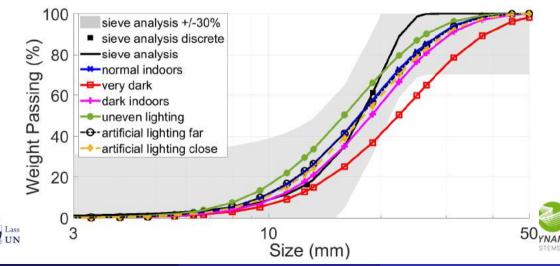


### Raw and delineated photos in ideal (a) and dark (b) lighting. a)

AMIC

b)

#### Rock fragmentation analysis results for indoor environment.



#### Illuminance Amount of luminous flux per unit area [lx]

Error Area between sieve and estimate curves [percent passing  $\times$  log(mm)]

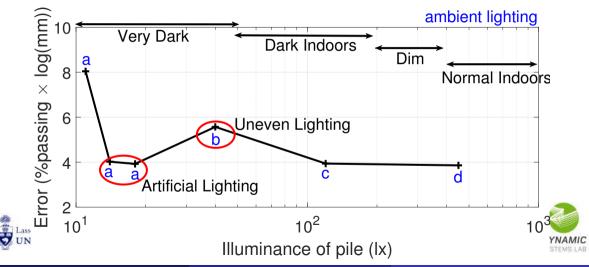




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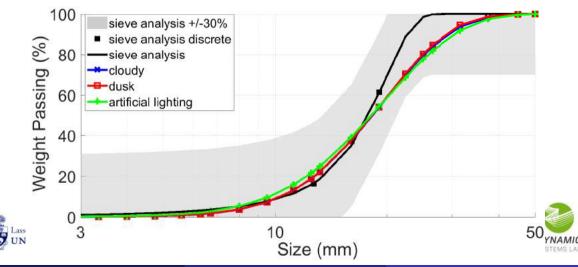
Rock Fragmentation Analysis Using UAV

Distribution error plotted with illuminance measurement for indoor environment.

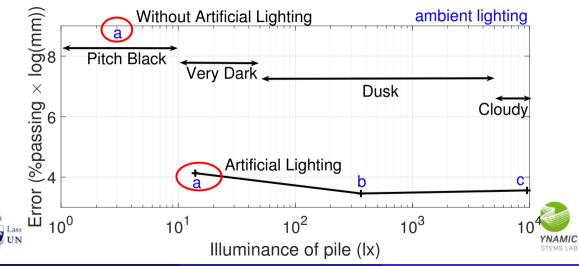


Rock Fragmentation Analysis Using UAV

#### Rock fragmentation analysis results for outdoor experiment.



Distribution error plotted with illuminance measurement for indoor environment.



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# **Future Work**

Items that have been raised during this work:

- Test concepts in a mining environment
- Incorporate measurement uncertainty into analysis
- Configure better cameras (ex. high dynamic range)
- Light inaccessible areas
- Increase control over image analysis
- Understand trade-offs using 3D techniques





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