# **GhostShot:** Manipulating the Image of CCD Cameras with Electromagnetic Interference

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#### **CCD Cameras**

The CCD (Charge Coupled Device) is a critical type of camera, and the reliability of the images it captures plays a key role in the decision-making of subsequent intelligent systems.



Global Charge-Coupled Device (CCD) Imagers Market is Expected to Account for USD XX Million by 2029 2022 2024 2025 ■ North America ■ Europe ■ Asia Pacific ■ South America ■ Middle East and Africa

**CCD Cameras Application** 

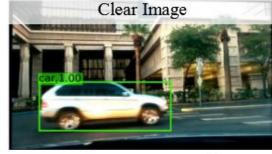
The growth of CCD market<sup>[1]</sup>

#### Previous Attacks on Cameras

Benign





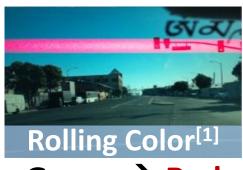




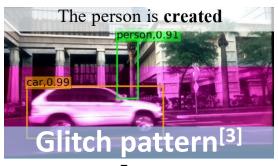












Green → Red

Car → None

None → Person

Can more **fine-grained** interference be implemented on camera systems?

- [1] Yan et al., Rolling Colors: Adversarial Laser Exploits against Traffic Light Recognition (USENIX 2022)
- [2] Ji et al., Poltergeist: Acoustic Adversarial Machine Learning against Cameras and Computer Vision (S&P 2021)
- [3] Jiang et al. GlitchHiker: Uncovering Vulnerabilities of Image Signal Transmission with IEMI (USENIX 23)

#### Previous Attacks on Cameras

#### Injection under dark conditions



#### Injection under normal light conditions



Previous work [1] shown the feasibility of injection into CCD sensors, however:

- Noticeable image could only be injected in a dark environment
- Injection changes are unnoticeable under normal light conditions

[1] S. Kohler et al. Signal Injection Attacks against CCD Image Sensors (ACM ASIACCS 22).

#### Previous Attacks on Cameras

#### Injection under dark conditions



#### Injection under normal light conditions



#### Previous work has inspired us to consider:

- Is this a real-world threat under normal lighting conditions?
- What are the limits of the attack's capability and the potential harm?

[1] S. Kohler et al. Signal Injection Attacks against CCD Image Sensors (ACM ASIACCS 22).

Can we inject arbitrary colorful patterns in any ambient light conditions into the image captured by CCD cameras?

# For Example

**Adversary** 





**CCD Camera**  **Night Vision Detection** 

**QR** code scanning

Fire detection







## For Example







**CCD Camera**  **Night Vision Detection** 

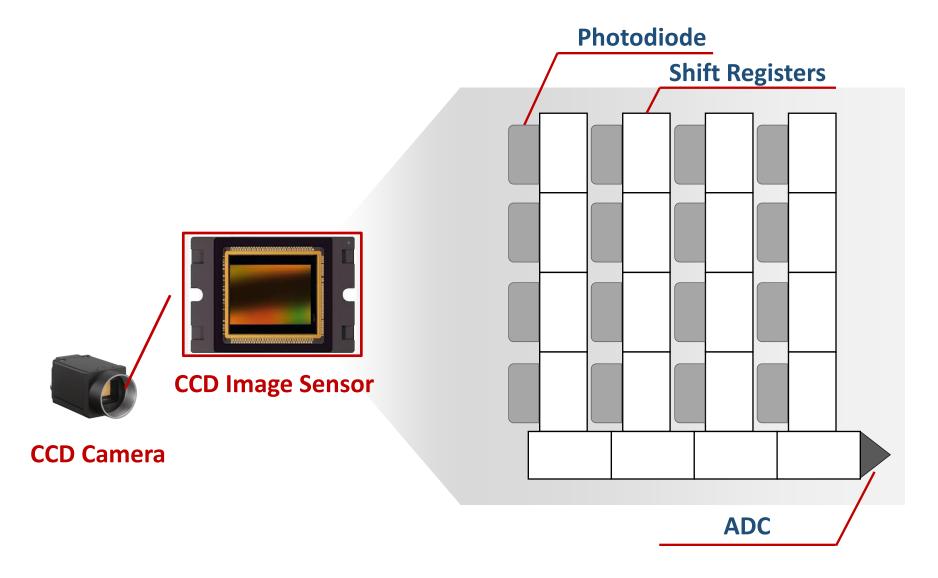
**QR** code scanning

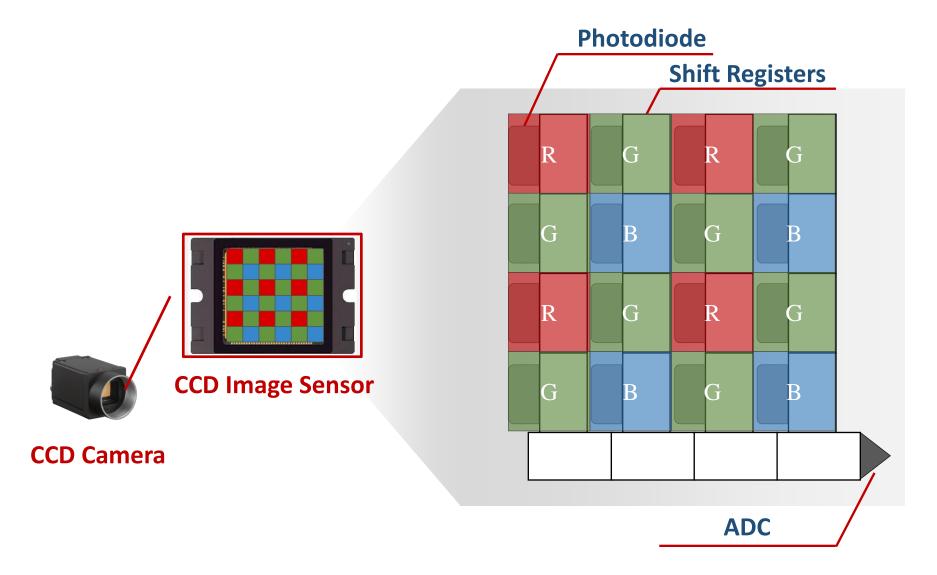
Fire detection

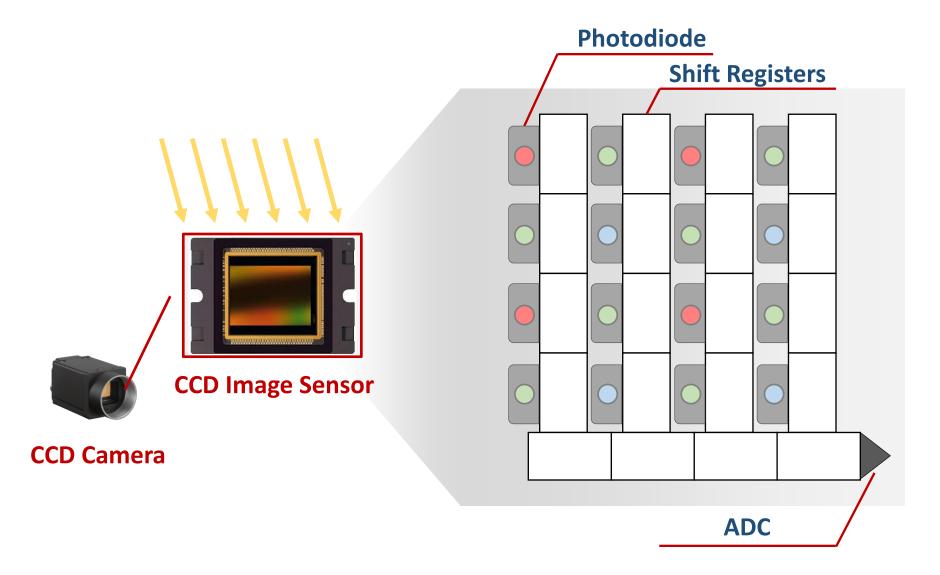


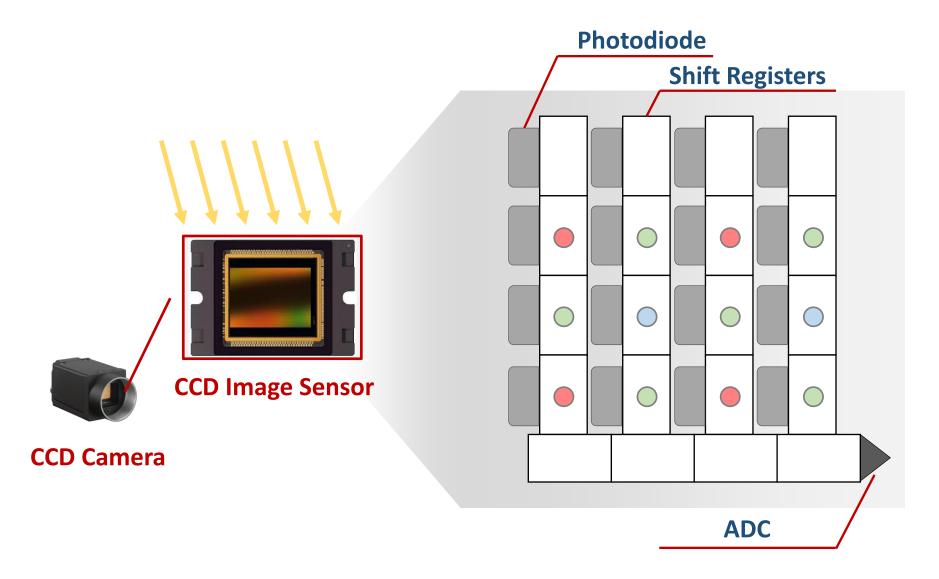


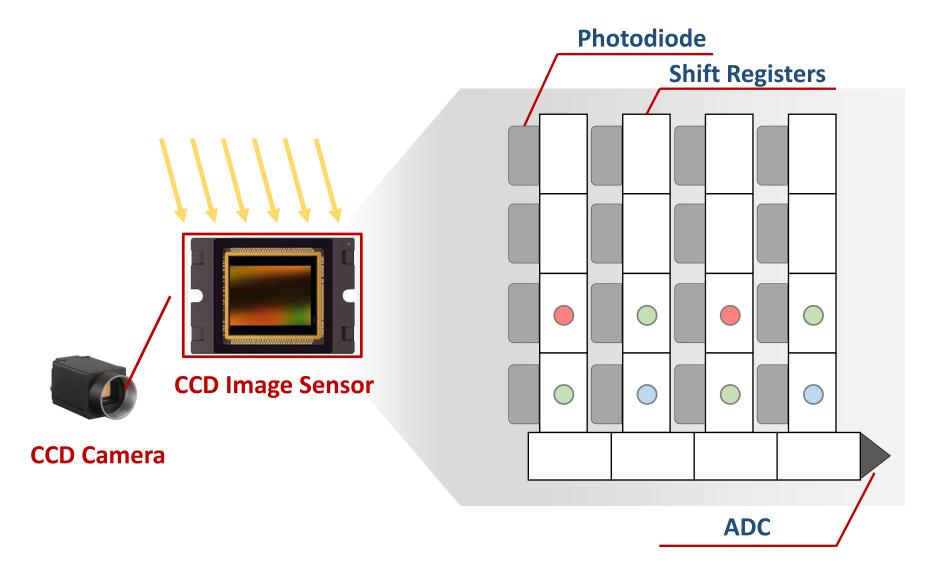


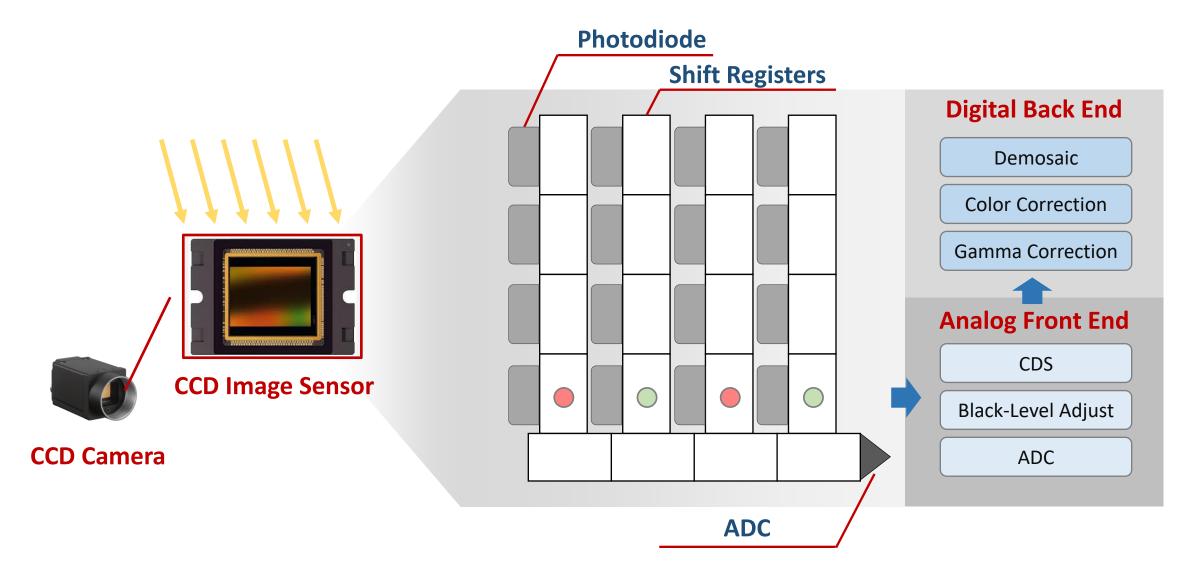


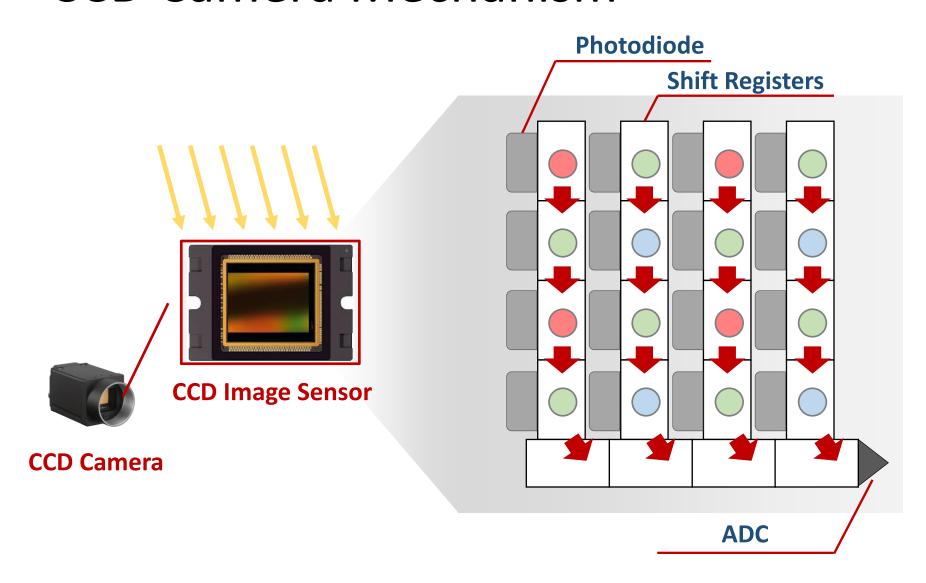




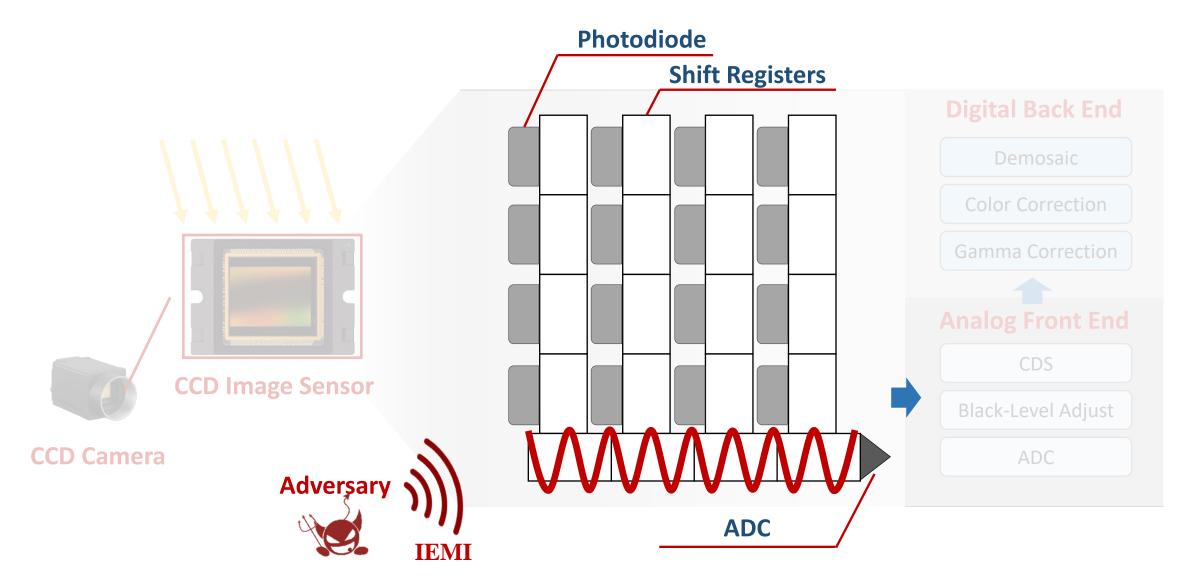




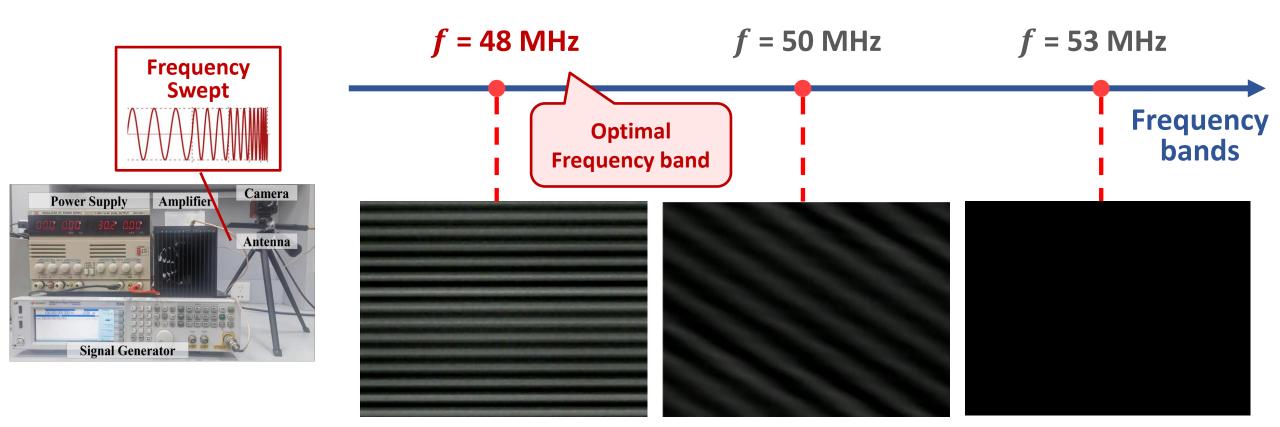




Signal Charge Readout in Order!

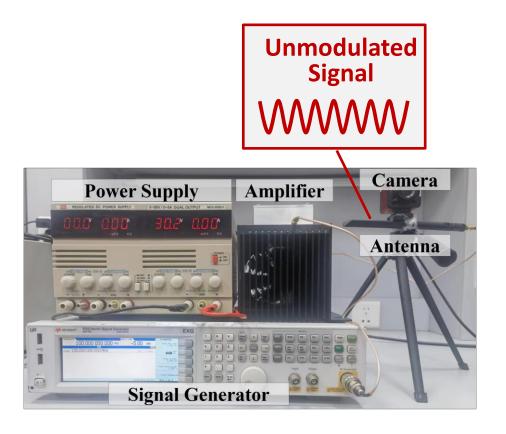


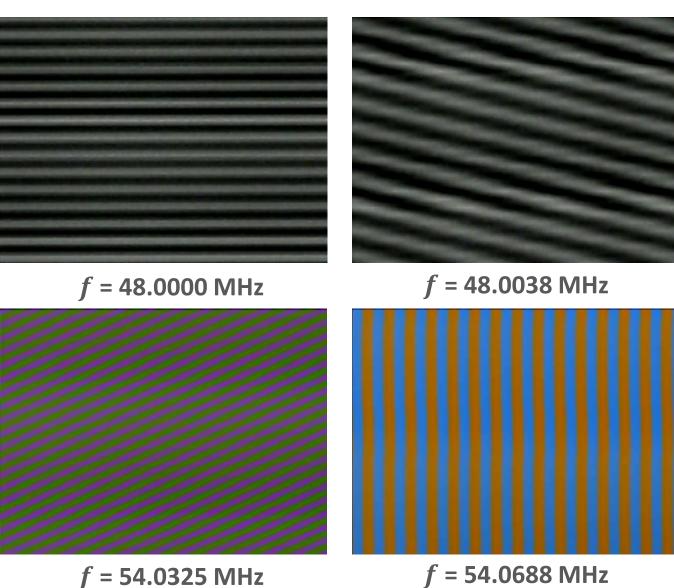
# **Preliminary Experiments**



The **optimal frequency band** depends on the **coupling frequency** of the camera's internal circuitry

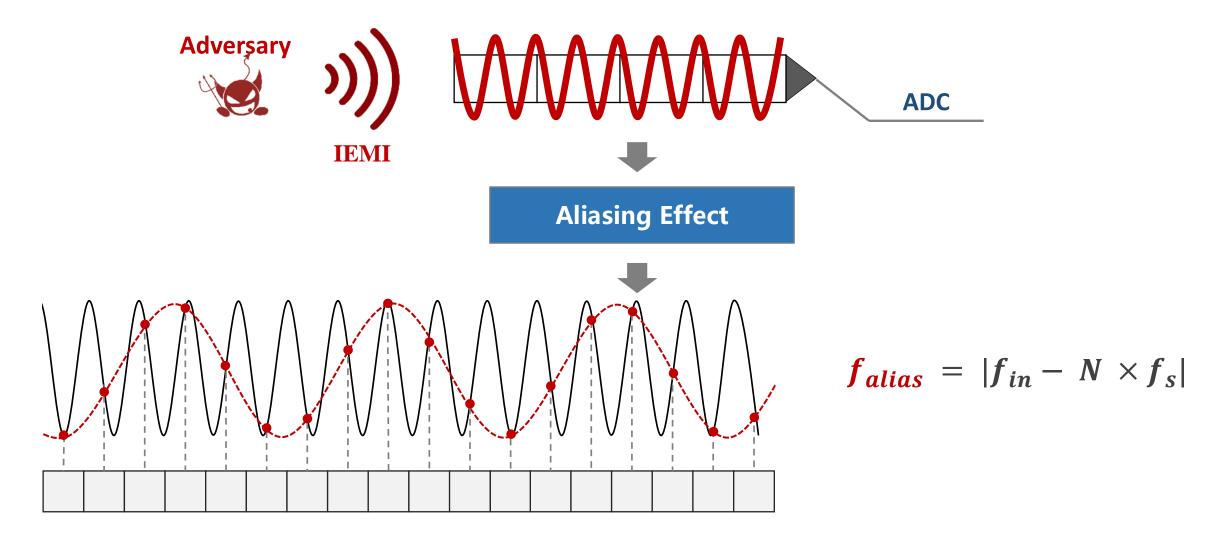
# **Preliminary Experiments**



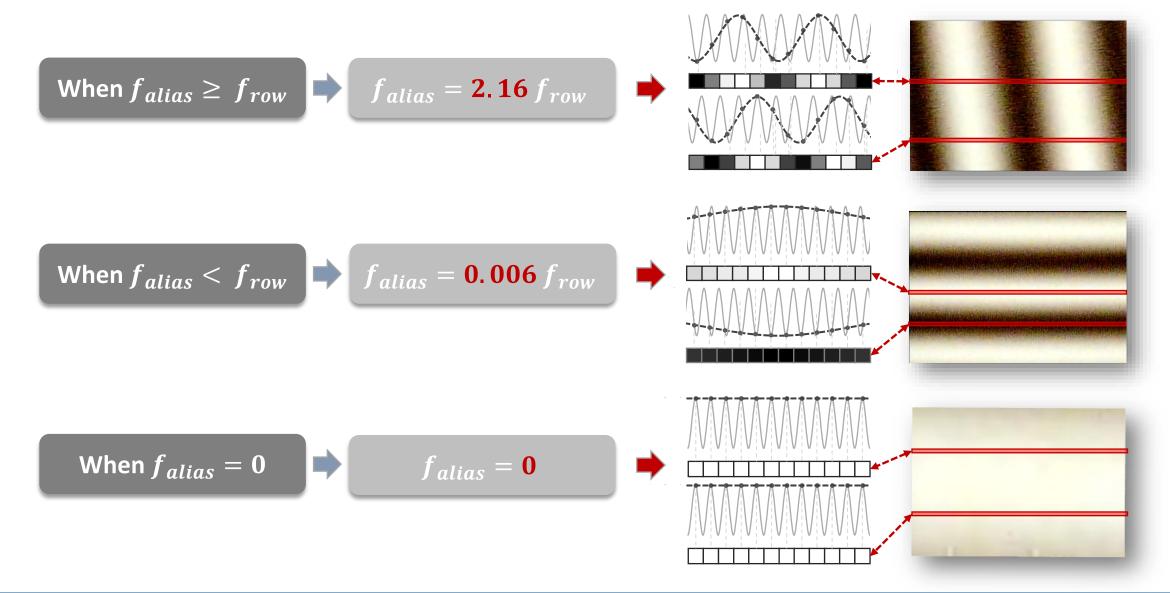




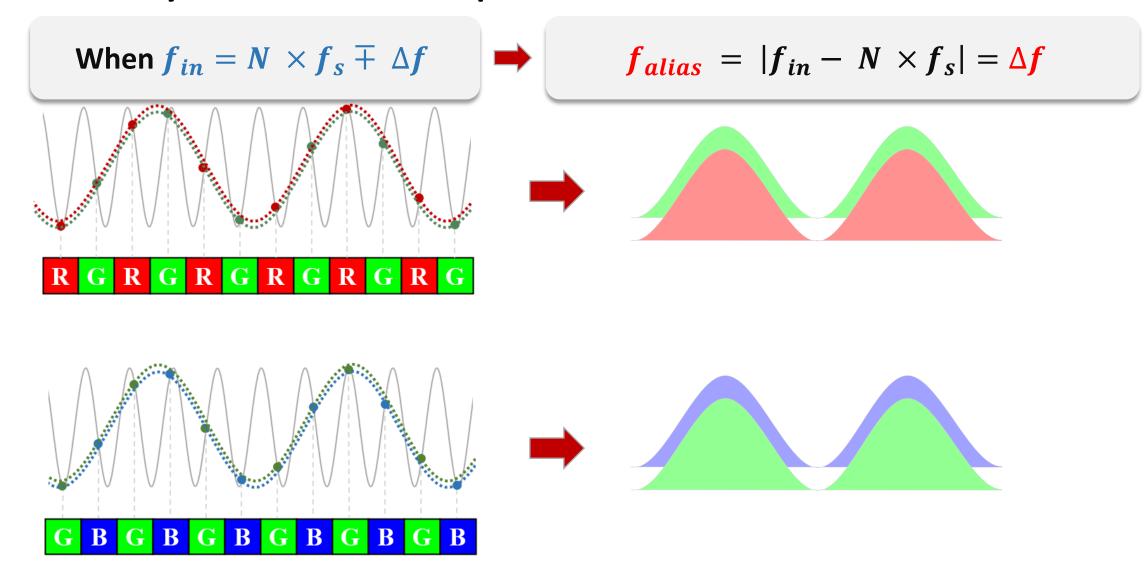
# Sampling and Aliasing



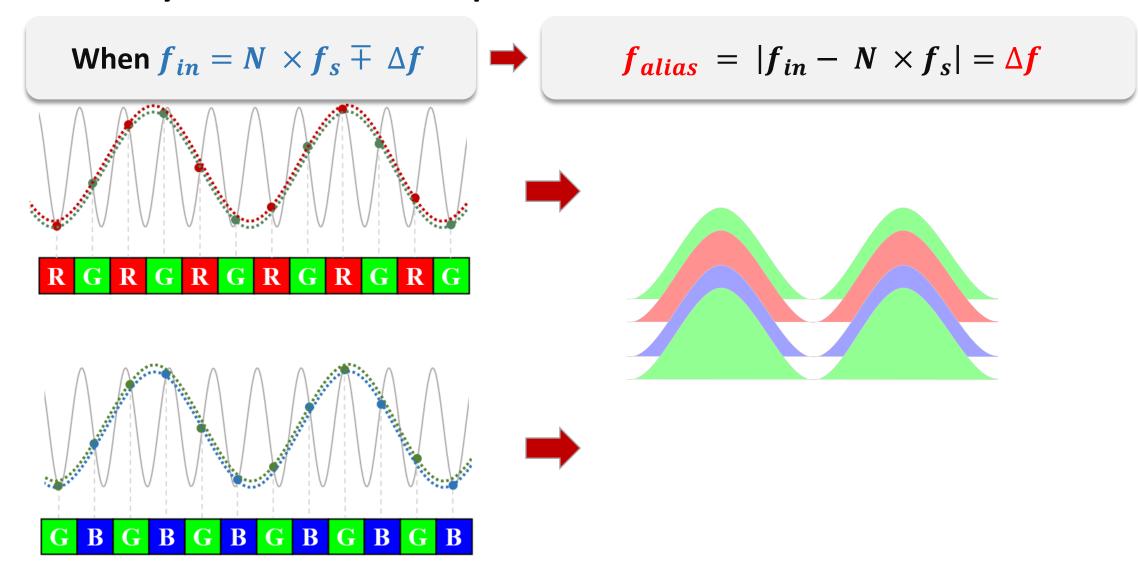
# Causality of Stripes



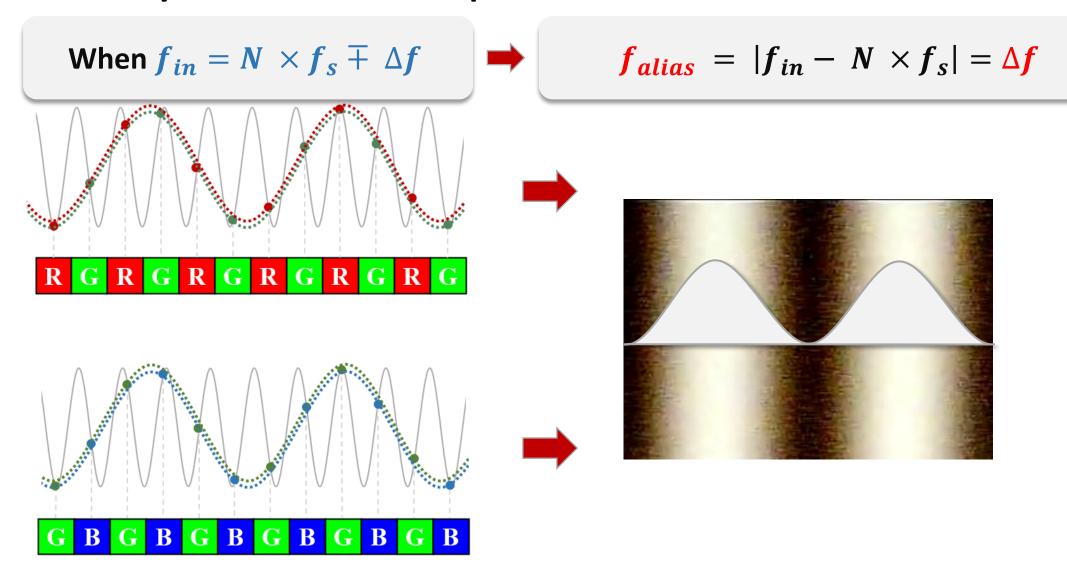
## Causality of Color Stripes



## Causality of Color Stripes

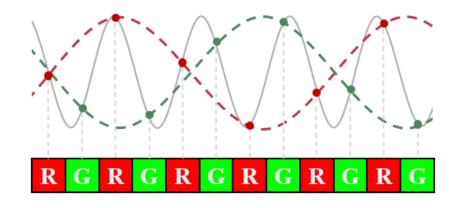


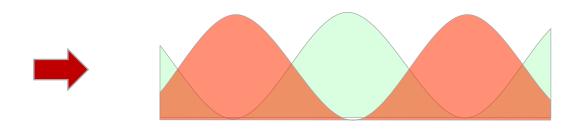
## Causality of Color Stripes

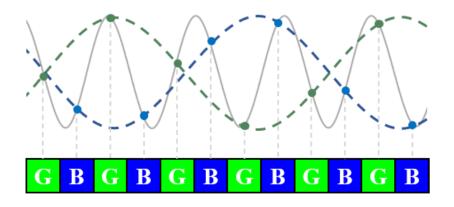


# Causality of Coloration

When 
$$f_{in} = \frac{N}{2} \times f_s \mp \Delta f$$
 $\Rightarrow$ 
 $f_{alias} = |f_{in} - N| \times f_s| = \frac{f_s}{2} \mp \Delta f$ 







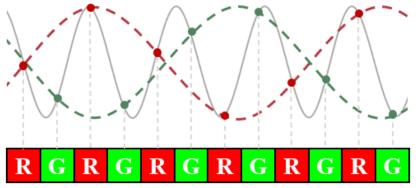


# Causality of Coloration

When 
$$f_{in} = \frac{N}{2} \times f_s \mp \Delta f$$

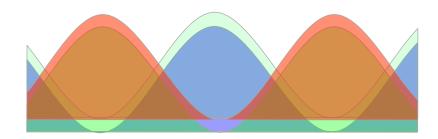


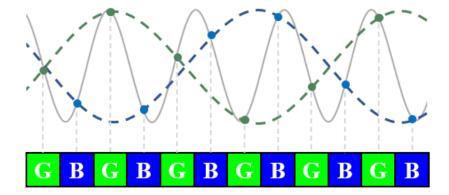
$$f_{alias} = |f_{in} - N \times f_s| = \frac{f_s}{2} \mp \Delta f$$











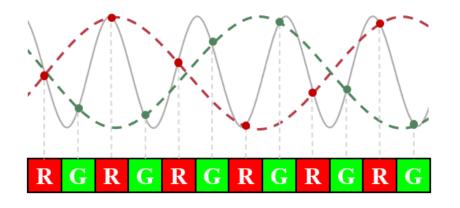


# Causality of Coloration

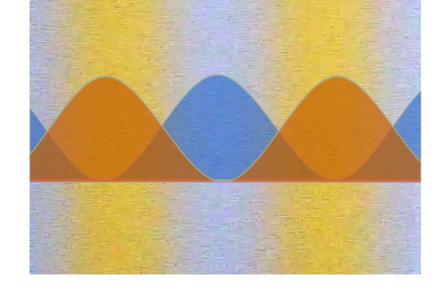
When 
$$f_{in} = \frac{N}{2} \times f_s \mp \Delta f$$

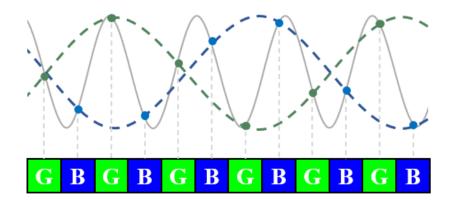


$$f_{alias} = |f_{in} - N \times f_s| = \frac{f_s}{2} \mp \Delta f$$







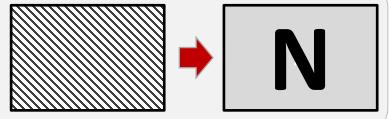




# Ability Investigation



Q1: How to control the morphology of the injection?





Q2: How to control the **brightness** of the injection?



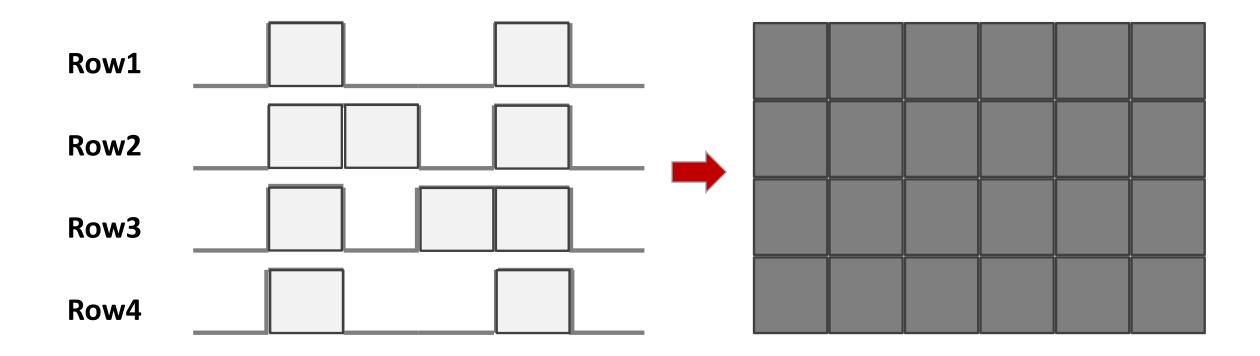


Q3: How to control the color of the injection?



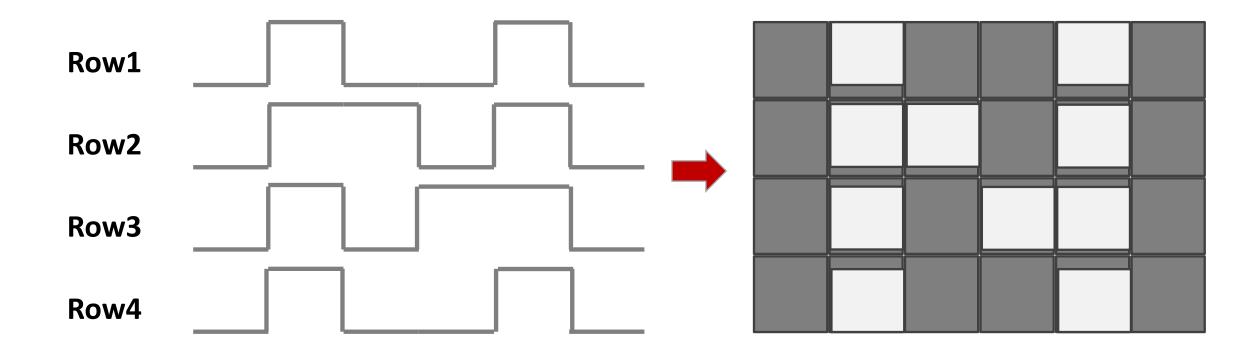
# Morphology Modulations

#### **Amplitude Modulation**

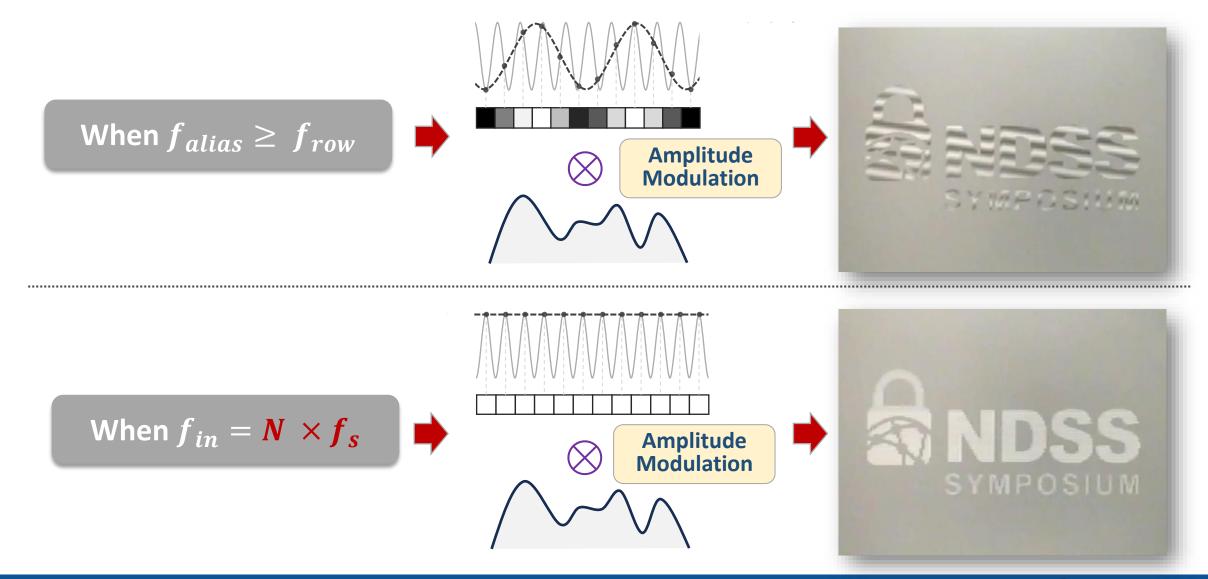


# Morphology Modulations

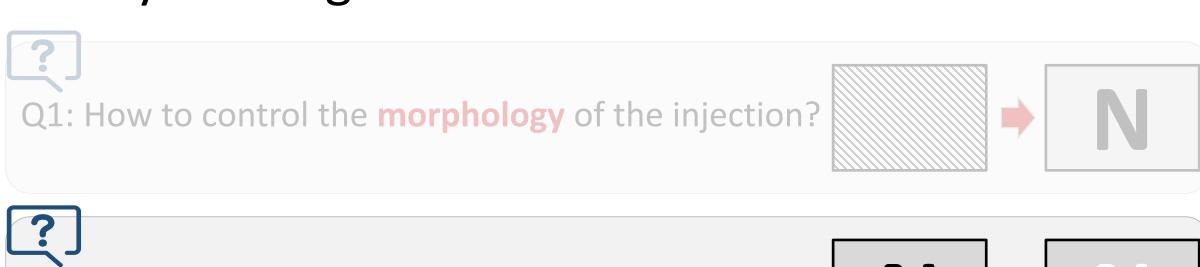
#### **Amplitude Modulation**



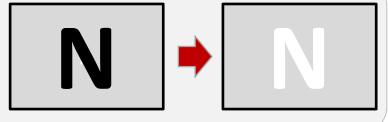
# Morphology Modulations



# **Ability Investigation**



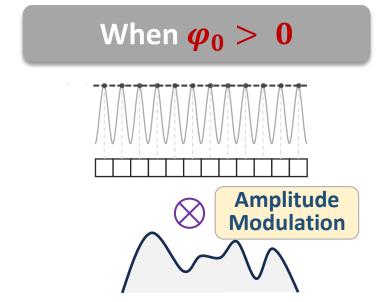
Q2: How to control the **brightness** of the injection?

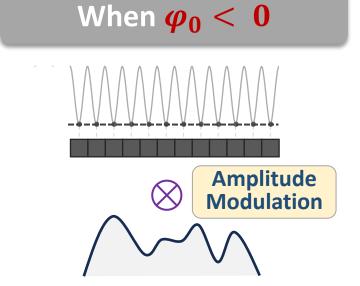


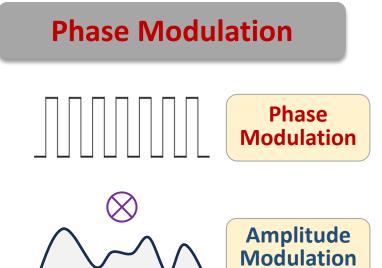




## **Brightness Modulations**





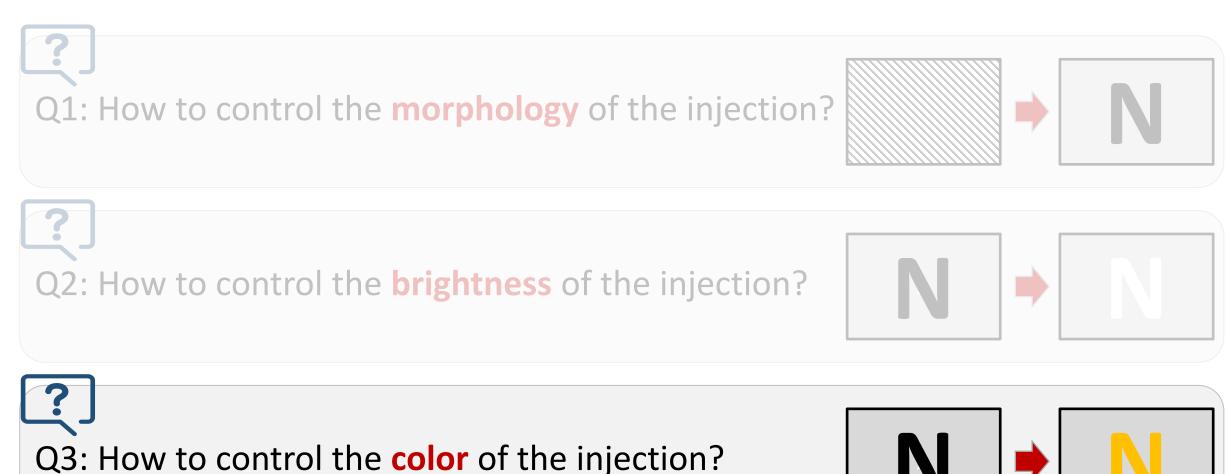






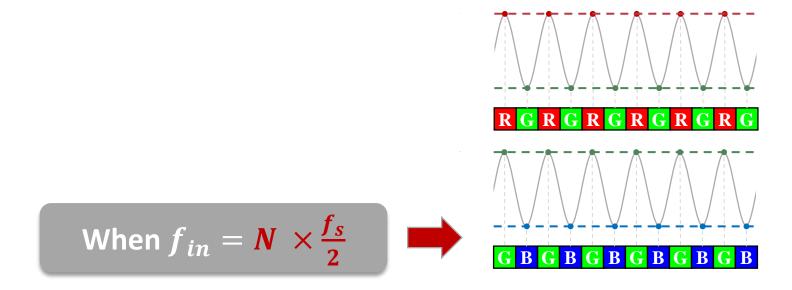


# Ability Investigation

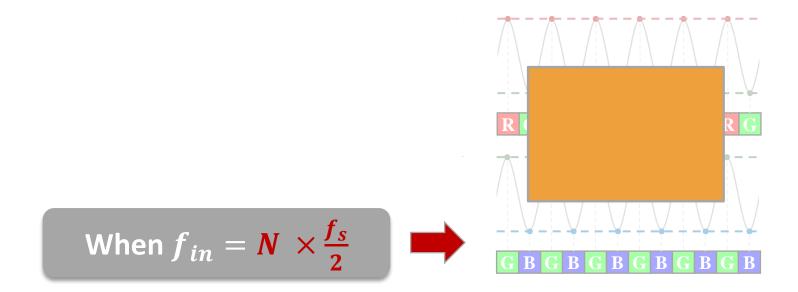




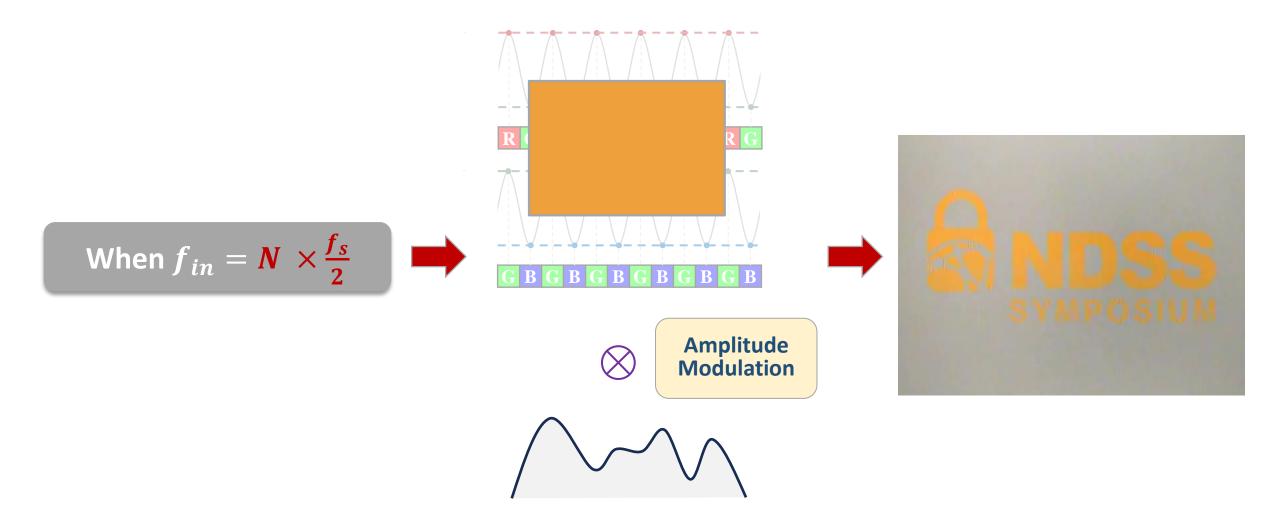
#### **Coloration Modulations**



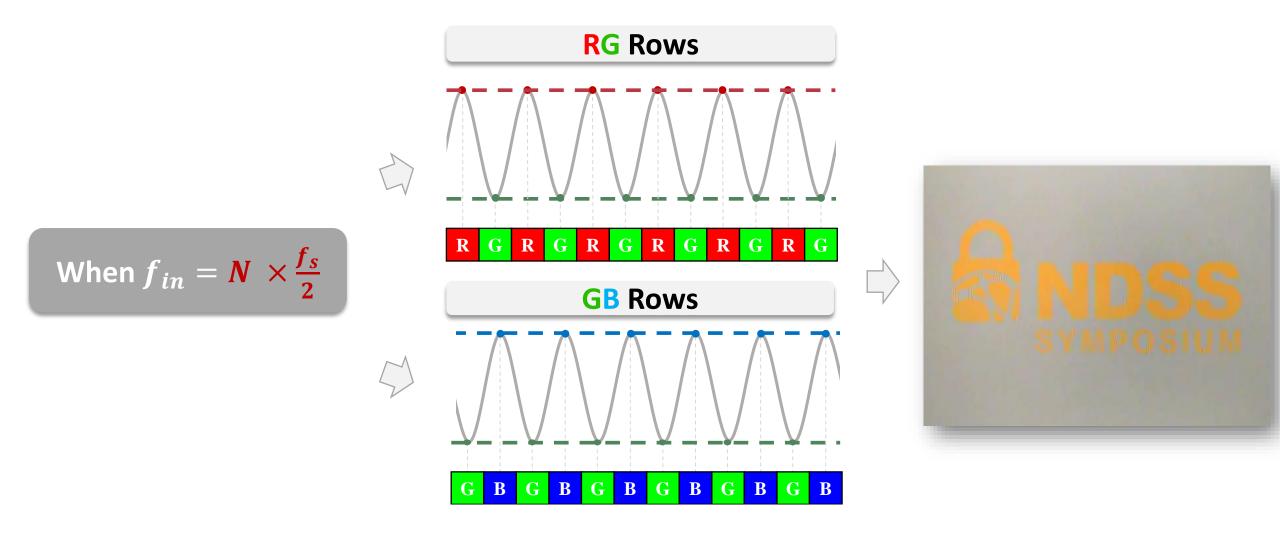
#### **Coloration Modulations**

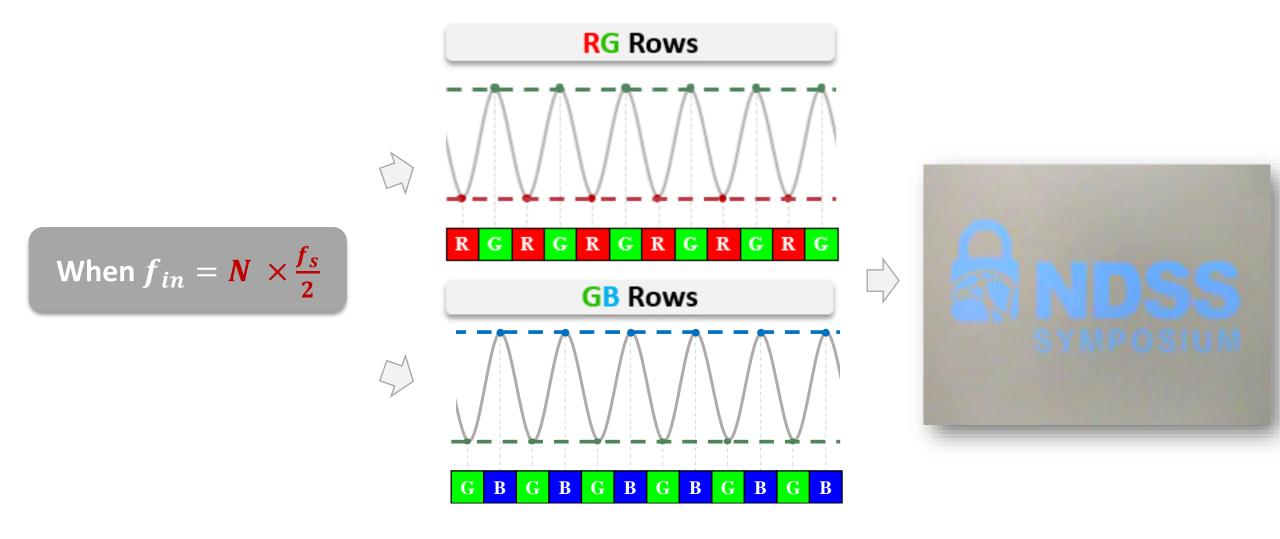


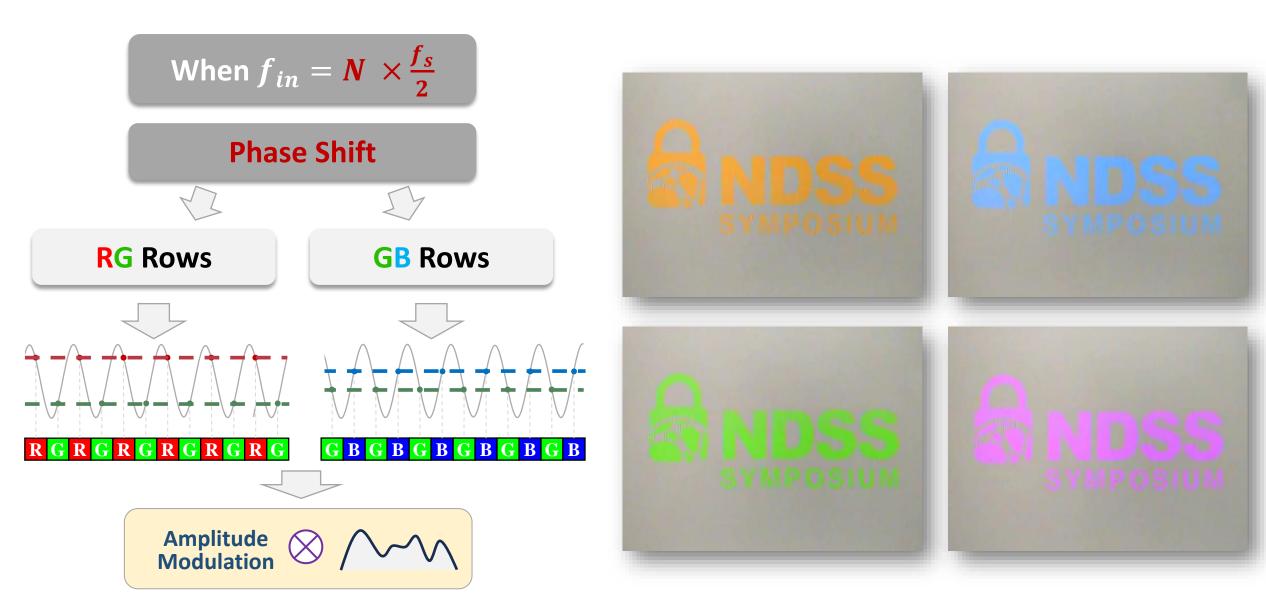
#### **Coloration Modulations**

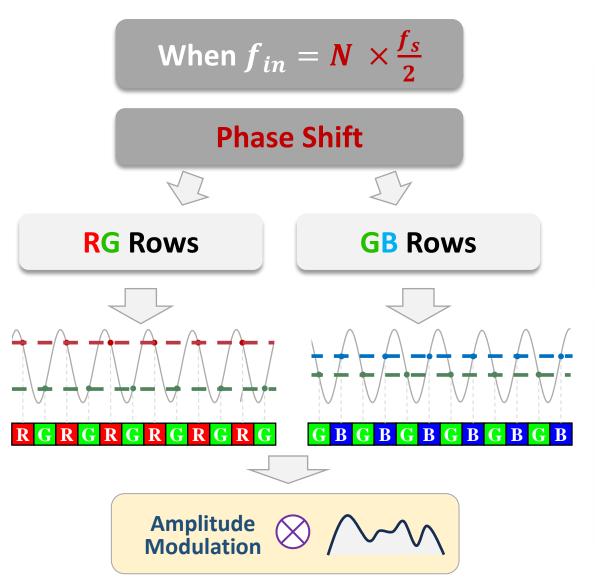






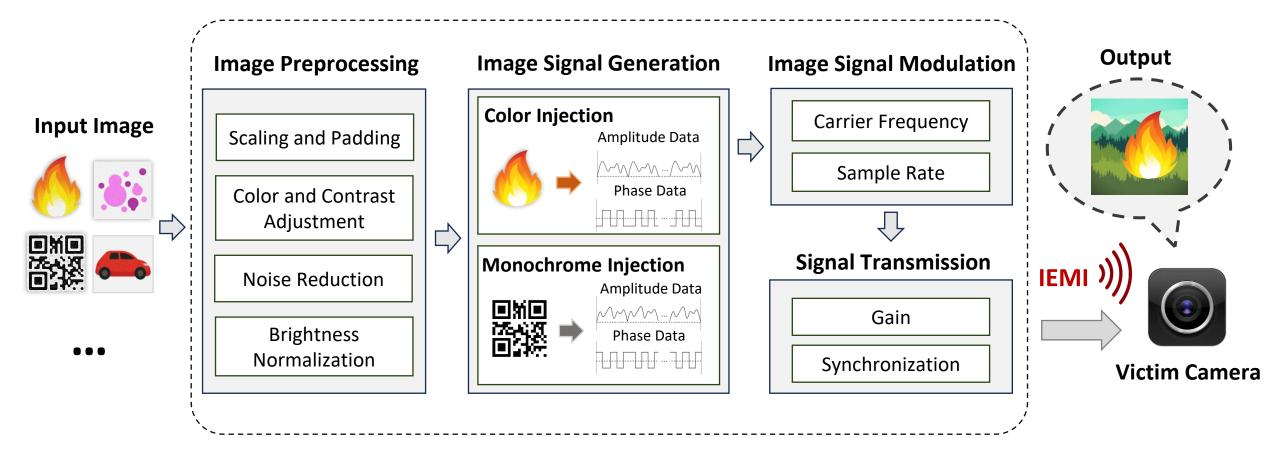








### Attack Design

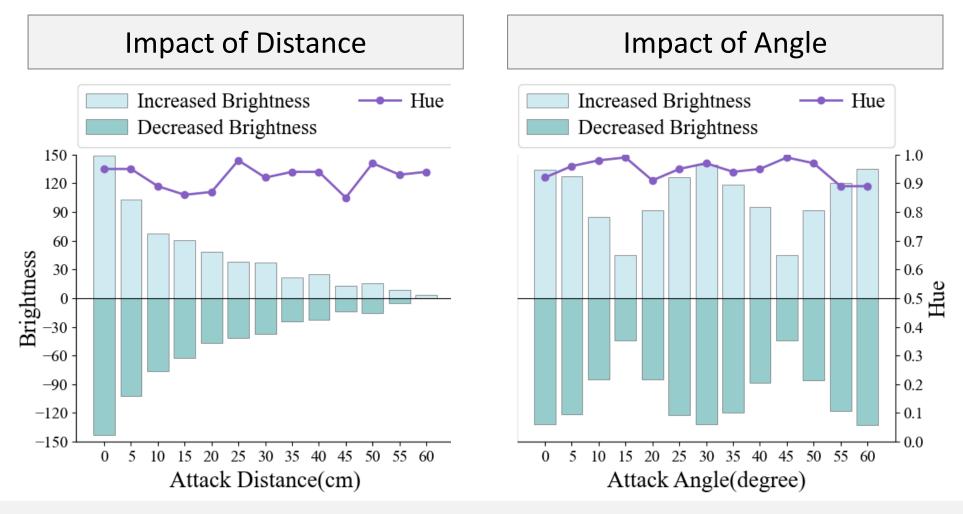


#### Attack on Various Cameras

We successfully perform color or monochrome injection attacks on 15 CCD cameras.

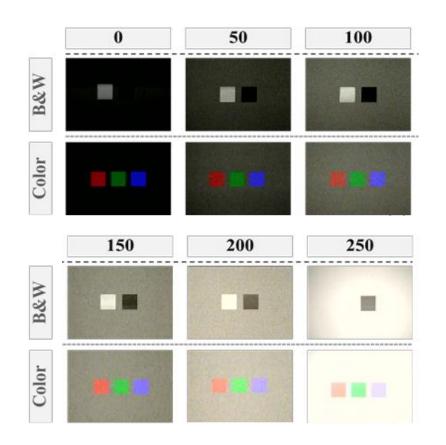
CCD Camera System and Sensor Configureation							Freq.Mono.(MHz)		Freq.Color(MHz)		Brightness	Hue
Type	Vendor	Model	Sensor Model		Res.	FPS	Range	Opt.	Range	Opt.	. [-255,255]	[0°,360°]
Analog CCTV	MingChuangDa	\	Sony	ICX811	976×582	50	53.2-57.6	55.6	67.6-71.1	69.2	-105~133	360°
	ShunHuaLi	SHL-223		ICX811	976×582	50	44.7-51.7	48.1	43.1-44.6	43.5	-138~156	360°
		SHL-019-1		ICX873	720×576	50	70.5-74.7	72.6	64.8-70.4	67.5	-124~139	360°
	Szrs	\		Unknown	640×480	60	85.2-89.2	87.3	51.3-53.5	52.6	-110~148	360°
	LantTian	TD-813		ICX663	976x582	60	47.4-48.7	47.9	57.3-59.8	58.0	-137~145	360°
	Mintron	MTV-37S10P		ICX405	798×548	50	94.4-98.2	96.0	60.8-64.9	62.4	-116~128	360°
		MTV-73X11HP		ICX409	798×548	50	97.2-99.1	98.2	67.2-69.1	68.4	-92~117	360°
	KangShi	\		ICX811	976×582	60	56.5-57.2	56.7	57.3-63.4	60.9	-108~131	360°
	Hayear	\		Unknown	1280×1024	60	81.5-86.0	83.7	74.3-77.1	75.6	-87~114	360°
	Basler	ACA1300-30GC		ICX445	1296×966	60	\	\	59.5-67.2	63.6	-59~64	360°
Ethernet	MindVison	MV-UBD130C	Sharp	Unknown	1280×960	35	\	\	41.3-66.5	53.9	-46~62	360°
Ethe		MV-GED130C		Unknown	1280×960	43	\	\	63.7-68.2	66.0	-55~69	360°
Digital		MV-UBD32C		Unknown	640×480	140	\	\	58.8-69.4	64.2	-88~103	360°
	DaHeng	MER-032-120GC		RJ33B	656×492	120	48.3-76.6	62.3	81.7-100	92.8	-34~41	360°
	Hikivision	MV-CE013-50GC		RJ33B4A	640×480	30	\	\	64.4-68.0	66.2	-37~59	360°

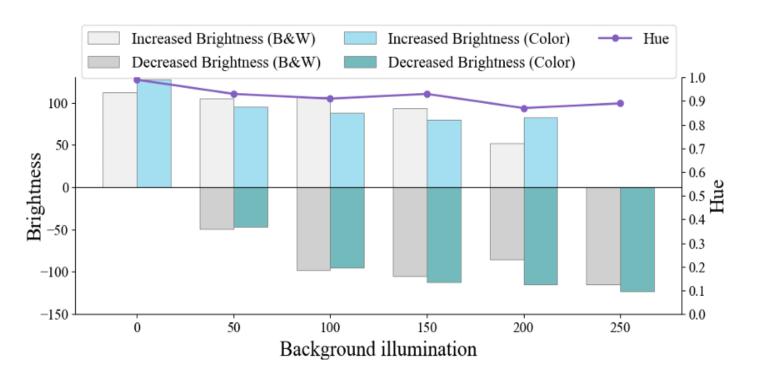
### Impact of Environment



Injection is robust at different angles, with a 40cm attack distance.

### Impact of Ambient Brightness





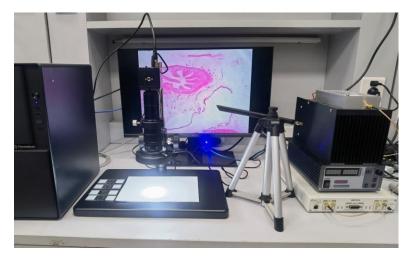
The injection exhibits robustness under various light conditions

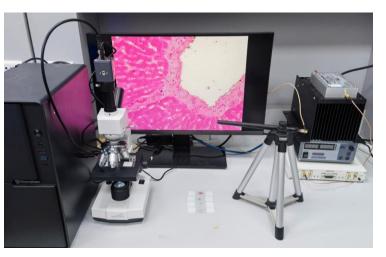
### Case Study 1: Medical Diagnosis

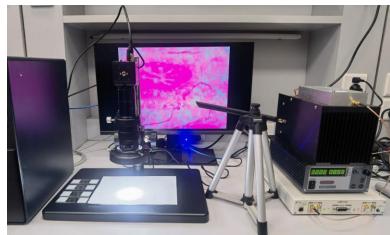
Model-1: SHL-10A

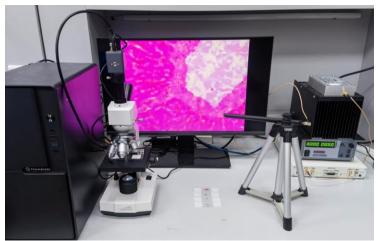
Model-2: SN-BP30

Benign









### Case Study 1: Medical Diagnosis

# **Creation Attack Ground Truth Creation Attack**

**Hiding Attack** 

**Ground Truth** 

**Hiding Attack** 

<b>Evaluation</b>
Results

Dataset	Model	Status	Metrics						
Dataset			Precision	Recall	Accuracy	F1-Score			
Complyon 16	on16 DSMIL	Benign Attack	0.68	0.59	0.66	0.63			
Cameryon 16		Attack	0.37	0.33	0.40	0.34			

### Case Study 2: Fire Detection



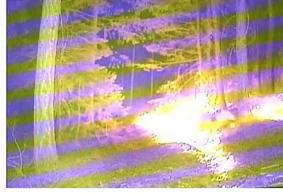
**Ground Truth: non-fire** 



**Ground Truth: fire, 0.78** 



**Creation Attack: fire, 0.77** 



**Hiding Attack: non-fire** 

#### **Evaluation Results**

Dataset	Model	Status	Metrics						
Dutuset	1/10401	Status	Precision	Recall	Accuracy	F1-Score			
	Yolov5	Benign	0.91	0.63	0.79	0.75			
NASA		Attack	0.09	0.08	0.15	0.09			
2018	FireNet	Benign	0.94	0.58	0.77	0.72			
	Firenet	Attack	0.11	0.09	0.18	0.10			
	Yolov5	Benign	0.96	0.68	0.83	0.80			
D-Fire	101073	Attack	0.14	0.11	0.21	0.12			
2 1110	FireNet	Benign	0.93	0.65	0.80	0.76			
		Attack	0.05	0.04	0.17	0.05			

### Case Study 3: QR Code Scanning



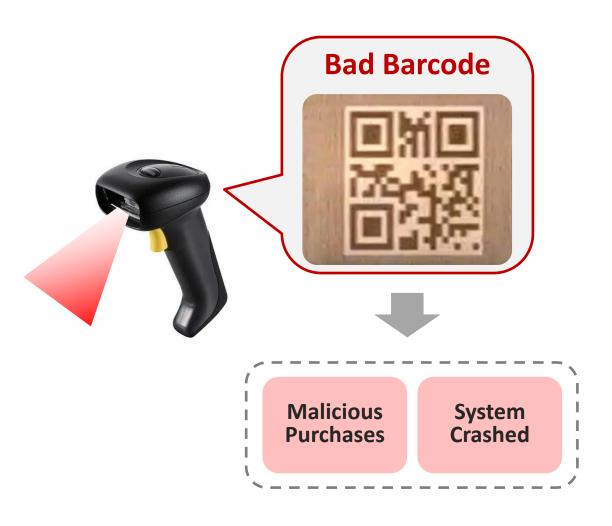
**Malicious Text Ground Truth** 



**Malicious Picture** 

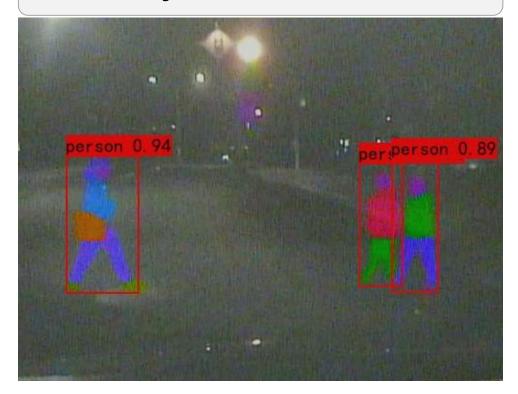


**Malicious Script** 



### Case Study 4: Night Vision Object Detection

#### **Injected Persons**



#### **Injected Cars**



The injection success rate was over 90% across 60 images.

### Case Study 5: Deceit to the human

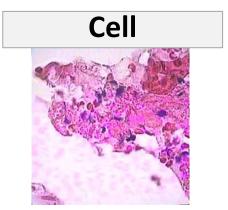
#### **Attack images in User Study:**













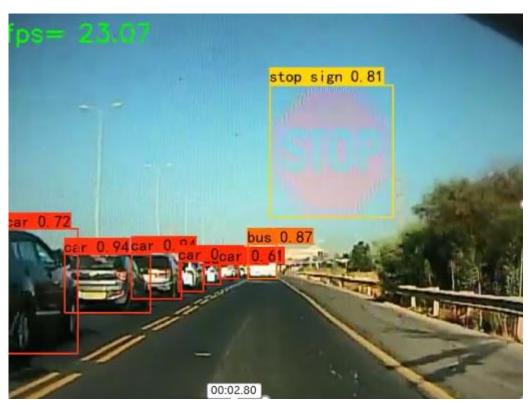


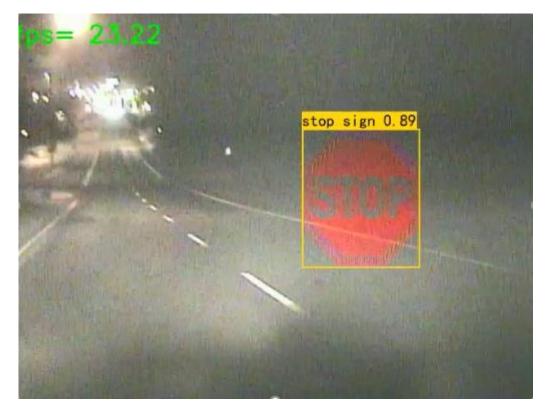
**Results** False Positive Rate: 0.30 False Negative Rate: 0.54 Accuracy: 0.58 \*questionnaires on 40 users

### **Dynamic Injection**

#### Demos can be found on <a href="https://sites.google.com/view/ghostshot">https://sites.google.com/view/ghostshot</a>

Demo-1 Demo-2





#### Countermeasures

- Shield CCD Cameras with specialized materials
- > Apply the low-pass filters and Include redundancy pixels
- Apply image forgery detection

#### Conclusion

- Design the attack against CCD cameras that can inject arbitrary monochrome or color images through IEMI.
- Perform attack with 15 CCD cameras, demonstrated the threat of the attack to computer vision systems and the ability to mislead humans.
- Propose hardware and software methods to defend against the attack.

## **GhostShot:** Manipulating the Image of CCD Cameras with Electromagnetic Interference

### Thanks for listening! Q&A









USSLAB







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### Synchronization From EMI Leakage

