



# Rendering Nighttime Image Via Cascaded Color and Brightness Compensation

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# Background

- Most of NN based ISP are designed to render daytime images.
- The lack of sufficient nighttime image dataset.
- Nighttime light sources are more complex.

# Solutions

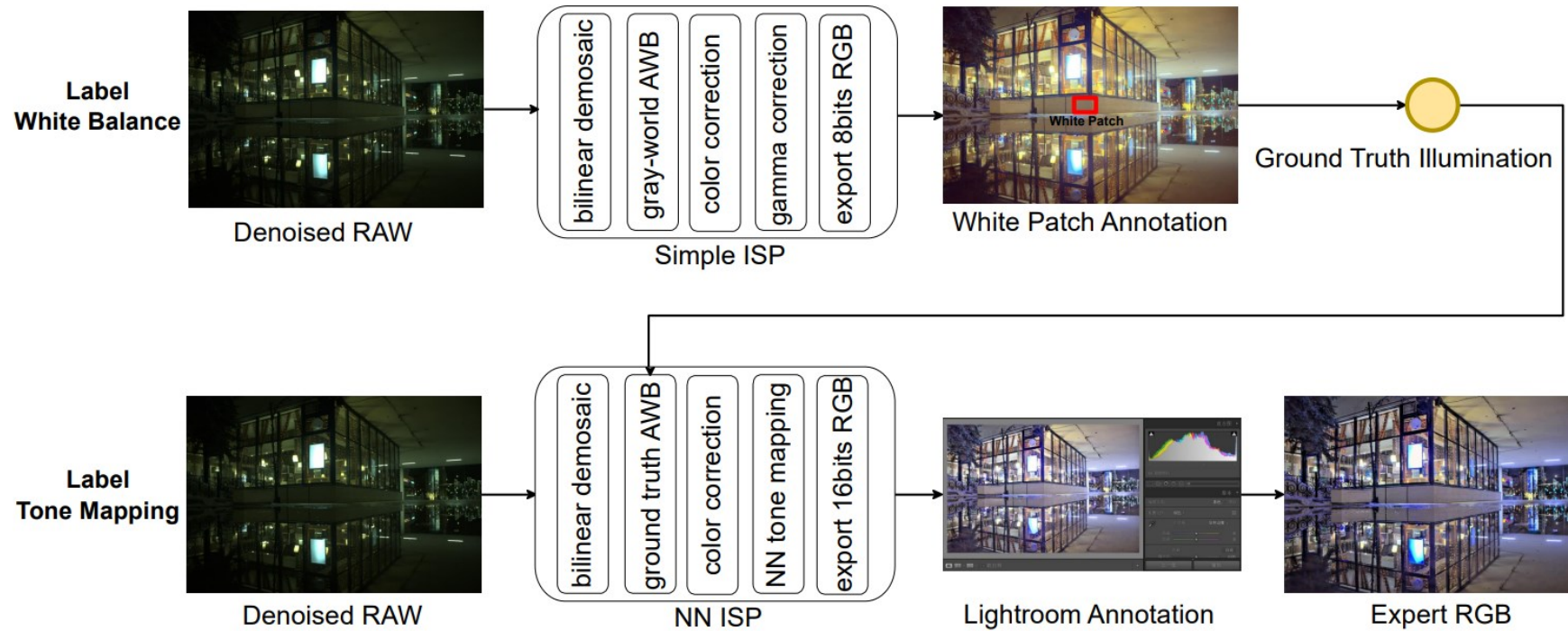
- **NR2R Dataset**

- We labeled a high-resolution nighttime RAW to RGB dataset to address the lack of paired RAW and RGB data.

- **CBUnet**

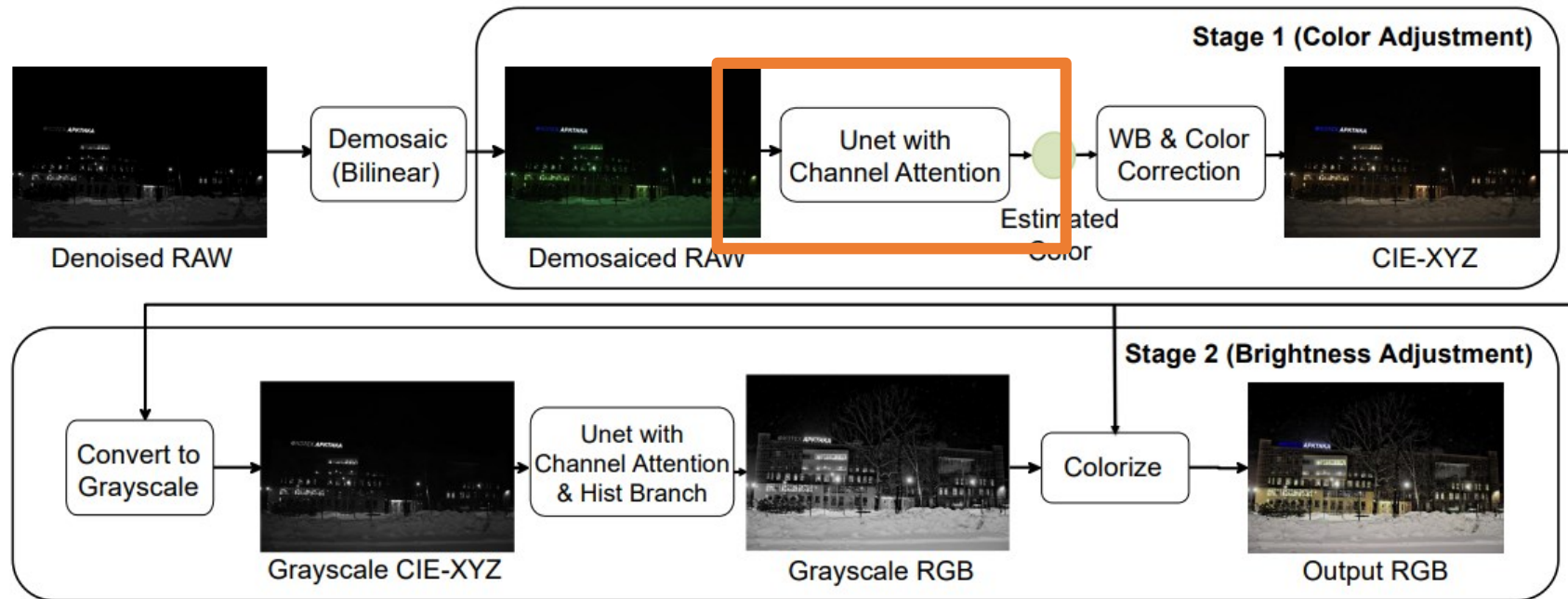
- A two-stage CBUnet is proposed to compensate color and brightness attributes consecutively.

# Method - NR2R Dataset



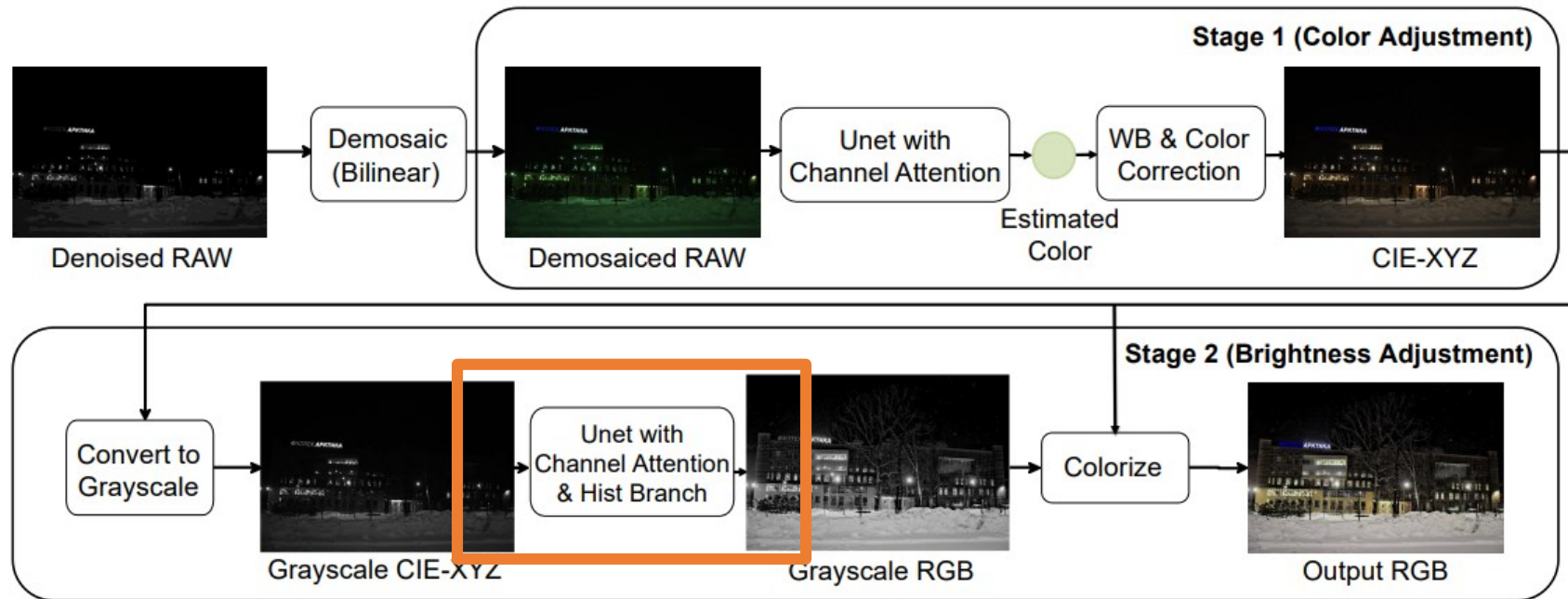
**Labeling pipeline:** White balance annotation → Input denoised RAW with estimated ground truth illumination into the NN ISP module → Use Lightroom to adjust global exposure, brightness, shadows and contrasts.

# Method - CBUnet Stage #1



**The architecture of the CBUnet:** Correct the color → Adjusts the brightness for a high-quality output.

# Method - CBUnet Stage #2



**The architecture of the CBUnet:** Correct the color → Adjusts the brightness for a high-quality output.

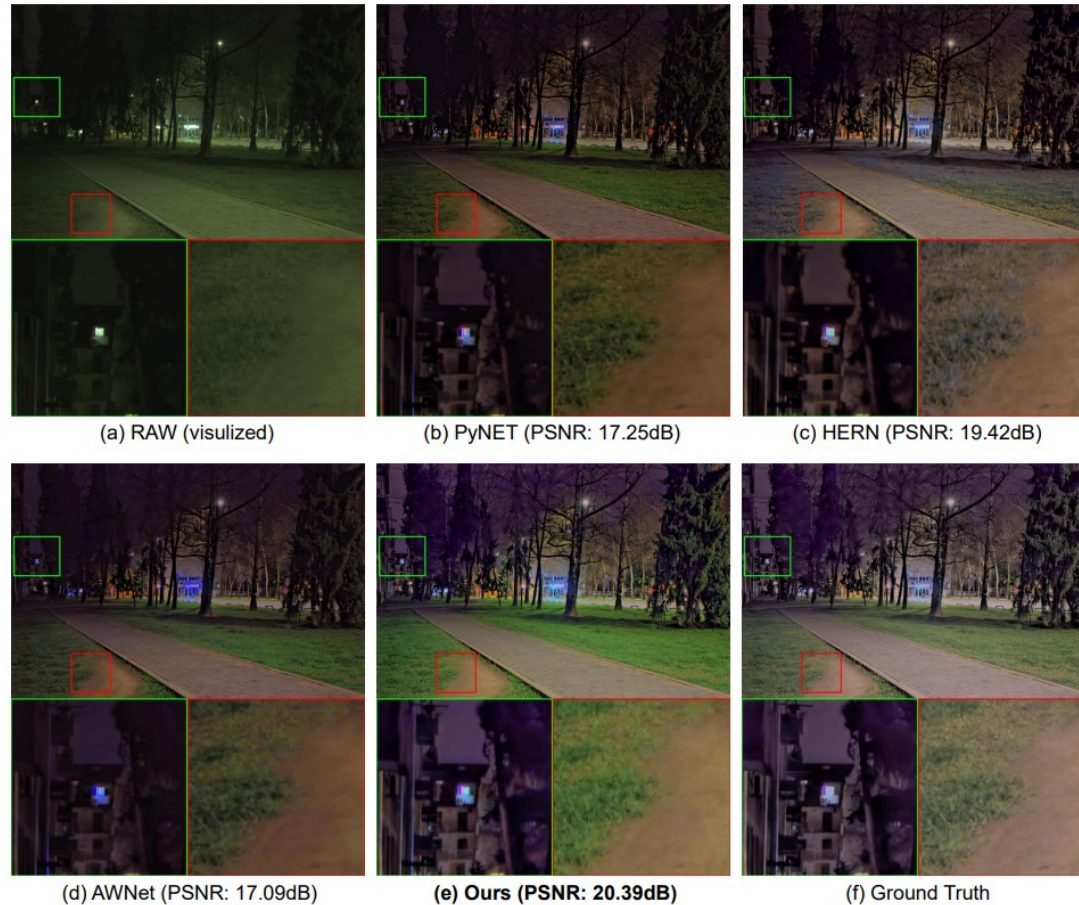
# Result - Comparative studies

Method	PSNR	Parameter (M)	FLOPs (G)
PyNET	20.67	47.55	1370.79
HERN	19.57	56.18	466.74
AWNNet	21.16	46.99	1532.46
<b>Ours</b>	<b>22.29</b>	<b>23.64</b>	<b>391.58</b>

**Comparative studies** of reconstruction PSNR, parameter size and FLOPs, where FLOPs is calculated when the input size is  $1024 \times 1024$ .



# Result - Comparative studies



**Visual comparison** of reconstructions from four different methods including PyNET, HERN, AWNet and our proposed CBUnet.

Our method have demonstrated the superior performance to other solution in synthesizing the **local details, color saturation and contrast**.



# Result - Ablation Study

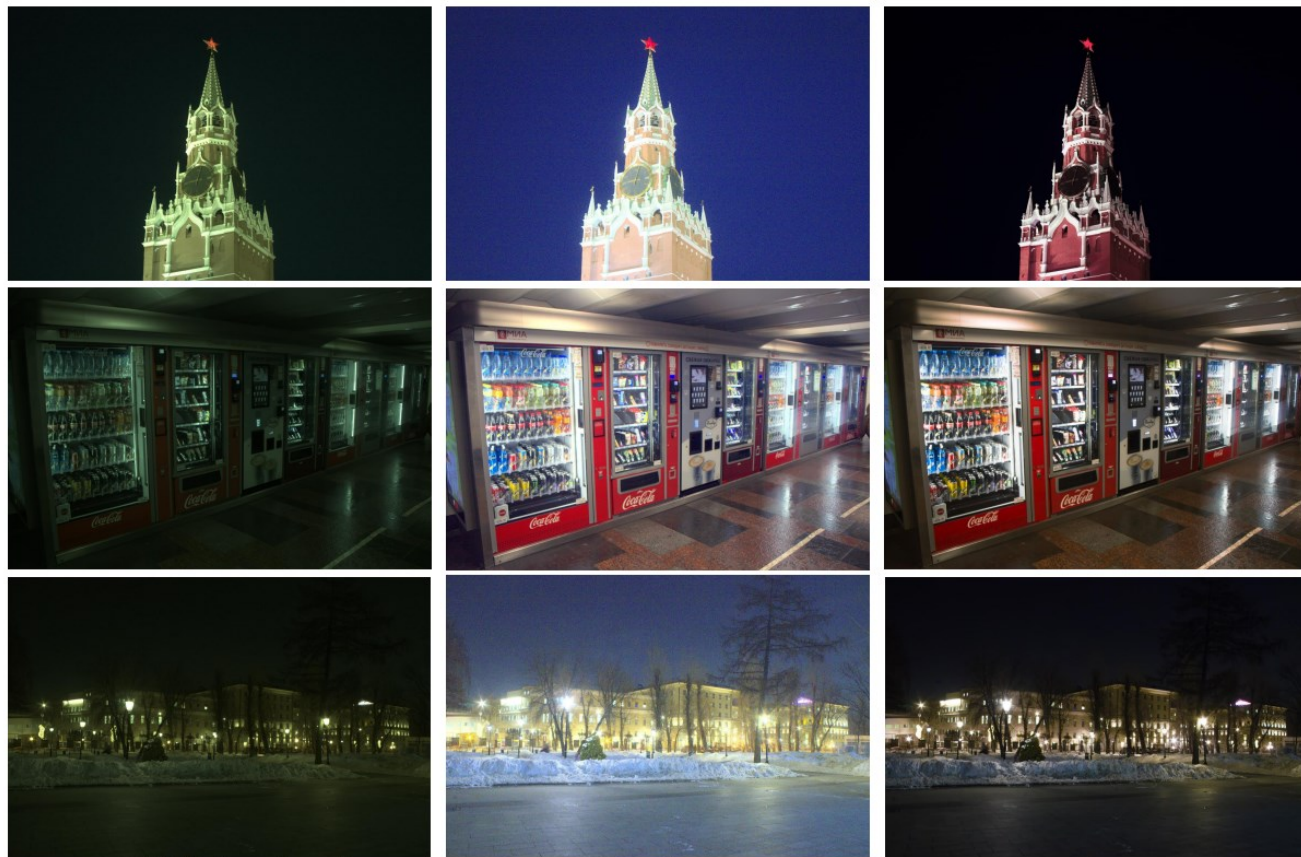
CA	Two Stage	Hist Branch	PSNR
			19.85
√			20.53
√	√		22.01
√	√	√	22.29

**Ablation studies** on network architectures, where CA and Hist Branch mean channel attention and histogram branch, respectively.

$L_1$	$L_{angular}$	$L_{hist}$	PSNR
√			21.98
√	√		22.14
√	√	√	22.29

**Ablation studies** loss functions.

# Result – Challenge Results



RAW(visualized)

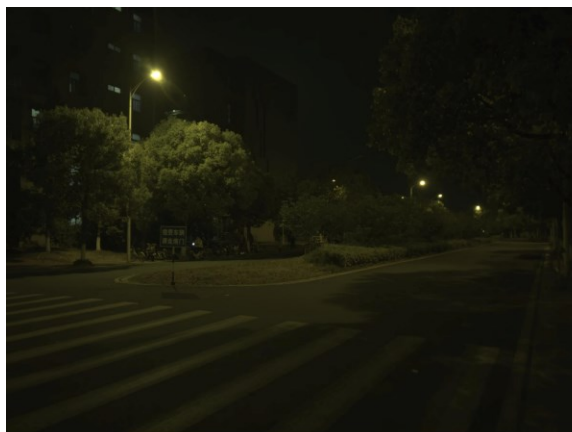
Baseline

Ours

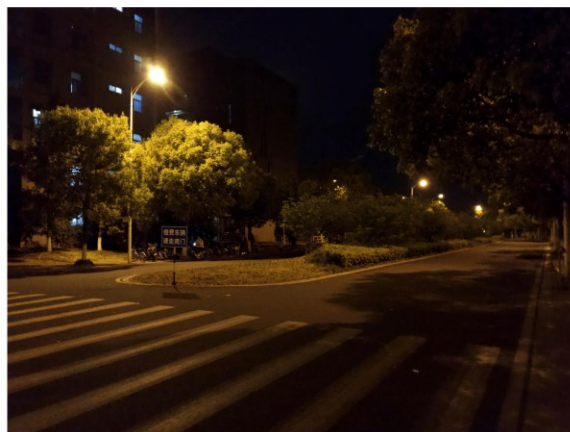
**Rendering** Results of our CBUnet in the NTIRE 2022 Photography Rendering Challenge.

Our renderings have a more **accurate white balance** and a **more consistent brightness distribution** with nighttime scene characteristics.

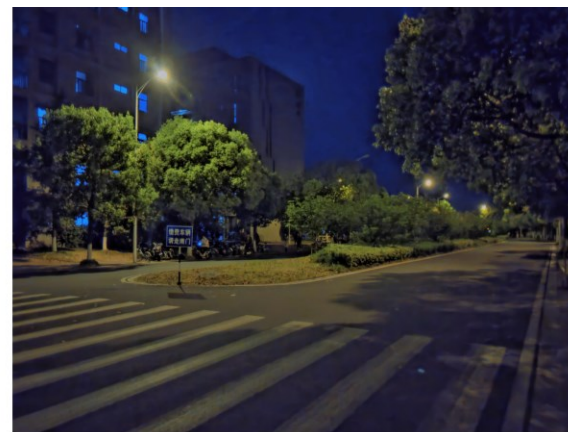
# Result – Cross Camera



RAW (visualized)



iPhone 8 Plus ISP



Ours

**Rendering** Results of our  
CBUnet within RAW image  
captured by **iPhone 8 Plus**

# Thanks

- Homepage: <https://njuvision.github.io/CBUnet/>
- Github: <https://github.com/NJUVISION/CBUnet>
- E-mail: lizhihao6\_at\_outlook.com