



SR-CACO-2: A Dataset for Confocal Fluorescence Microscopy Image Super-Resolution

Soufiane Belharbi¹, Mara KM Whitford^{2,3}, Phuong Hoang², Shakeeb Murtaza¹, Luke McCaffrey^{2,3,4}, and Eric Granger¹

¹ LIVIA, ILLS, Dept. of Systems Engineering, ETS Montreal, Canada

² Goodman Cancer Institute, McGill University, Montreal, Canada

³ Dept. of Biochemistry, McGill University, Montreal, Canada

⁴ Gerald Bronfman Dept. of Oncology, McGill University, Montreal, Canada

{soufiane.belharbi,eric.granger}@etsmtl.ca, luke.mccaffrey@mcgill.ca

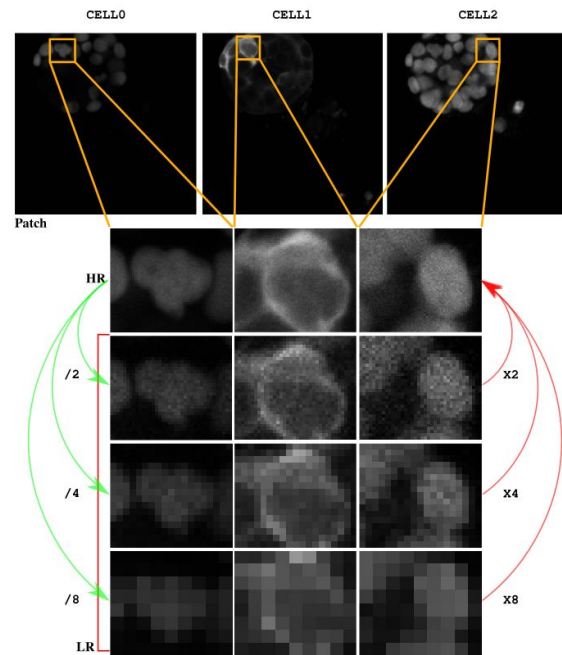


Why New Dataset?

- There are only **very few** microscopy super-resolution **datasets**
- Existing super resolution microscopy **datasets are private**
- Confocal imaging is widely accessible
- The need to **upscale LR images with less photobleaching and phototoxicity (cell damage)** using machine learning → need of data

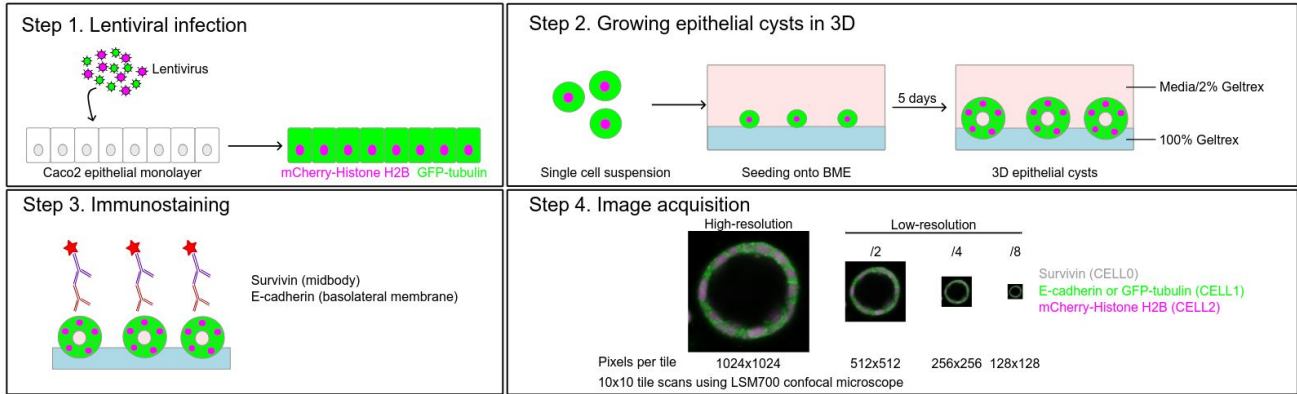
SR-CACO-2 Dataset

- Confocal imaging
- Real pairs: LR, HR
- Diverse: 4 scales: HR, LR ($/2$, $/4$, $/8$), 3 protein markers, 16, 800 multi-cellular objects
- Per-scale: 22,00 unique images (22 tiles), +9k patches (512x512)
- Designed for super-resolution task



SR-CACO-2: Capture

- Based on human epithelial cell line Caco-2 (ATCC HTB-37)
- Fixed-imaging with simulated live-imaging (3D)



SR-CACO-2: Access

- Freely accessible under license: CC BY-NC-SA 4.0

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<https://github.com/sbelharbi/sr-caco-2>

More details



<https://arxiv.org/pdf/2406.09168>

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+ Benchmarking of 16
SISR methods

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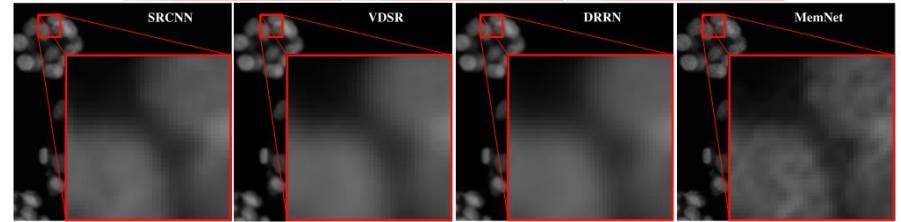
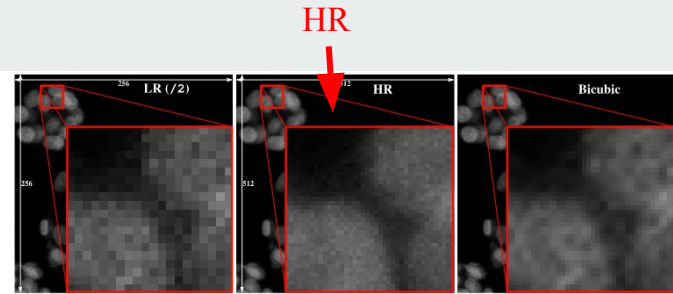
More details



<https://arxiv.org/pdf/2406.09168>

SR-CACO-2: Usage

Super-resolution task

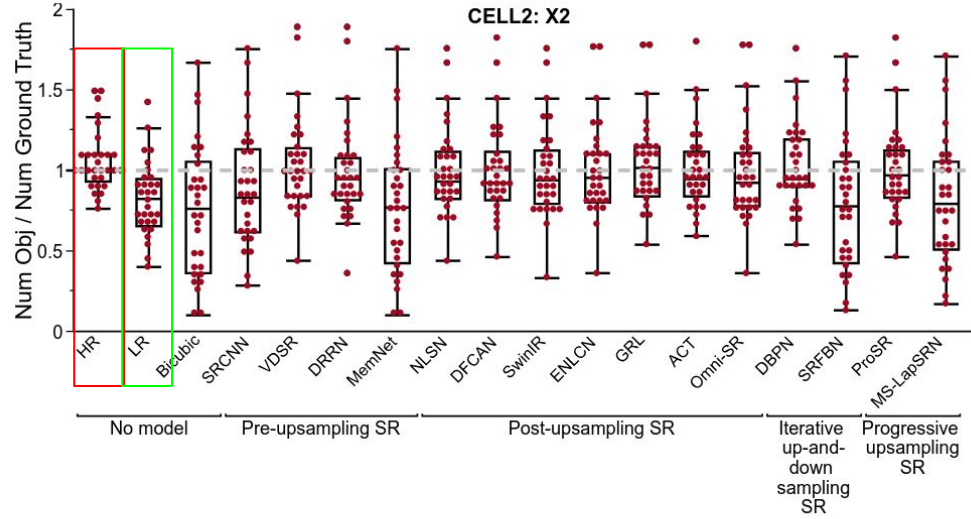


Limited results

SISR Methods	Scale	PSNR ↑					NRMSE ↓				SSIM ↑		
		CELL0	CELL1	CELL2	Mean	CELL0	CELL1	CELL2	Mean	CELL0	CELL1	CELL2	Mean
Bicubic	X2	35.02	32.15	30.38	32.52	0.1085	0.0601	0.0724	0.0803	0.7618	0.7658	0.6891	0.7389
	X4	35.46	32.03	31.10	32.86	0.0985	0.0586	0.0660	0.0744	0.8206	0.8002	0.7673	0.7960
	X8	31.88	27.50	26.10	28.49	0.1655	0.1139	0.1349	0.1381	0.6683	0.6266	0.6511	0.6487
Pre-upsampling SR													
SRCNN [19] (eccv,2014)	X2	37.54	34.27	33.42	35.08	0.0710	0.0450	0.0500	0.0553	0.8517	0.8524	0.8210	0.8417
	X4	36.14	32.73	32.25	33.71	0.0817	0.0528	0.0572	0.0639	0.8522	0.8216	0.8079	0.8272
	X8	33.05	28.04	26.49	29.19	0.1265	0.0967	0.1220	0.1151	0.7711	0.7085	0.7092	0.7296
Post-upsampling SR													
Omni-SR [85] (cvpr,2023)	X2	37.70	34.11	33.51	35.11	0.0759	0.0461	0.0496	0.0572	0.8744	0.8539	0.8313	0.8532
	X4	36.44	32.59	32.34	33.79	0.0849	0.0536	0.0563	0.0649	0.8592	0.8203	0.8111	0.8302
	X8	30.75	27.16	25.30	27.74	0.1713	0.1098	0.1352	0.1387	0.6715	0.6419	0.6591	0.6575
Iterative up-and-down sampling SR													
SRFBN [54] (cvpr,2019)	X2	36.13	33.15	31.61	33.63	0.0955	0.0531	0.0625	0.0704	0.8078	0.8091	0.7470	0.7880
	X4	36.08	32.52	31.79	33.46	0.0911	0.0545	0.0605	0.0687	0.8405	0.8147	0.7889	0.8147
	X8	32.27	27.78	26.47	28.84	0.1560	0.1091	0.1278	0.1310	0.7022	0.6549	0.6904	0.6825
Progressive upsampling SR													
MS-LapSRN [44] (tpami,2019)	X2	33.88	32.36	29.34	31.86	0.1130	0.0535	0.0791	0.0819	0.7652	0.8164	0.7695	0.7837
	X4	30.80	30.99	31.08	30.96	0.1192	0.0615	0.0626	0.0811	0.7885	0.7837	0.7806	0.7843
	X8	31.83	27.14	25.06	28.01	0.1404	0.0982	0.1323	0.1236	0.7478	0.6933	0.6640	0.7017

SR-CACO-2: Usage

Microscopy
downstream
tasks over cells



Model versus HR		
Level	Score Mean Diff	p-Value
LR	-18	0.001
Bicubic	-21.3667	<.0001
SRCNN	-16.5667	0.0034
VDSR	7.0333	0.6868
DRRN	2.3333	1
MemNet	-18.7667	0.0005
NLSN	-4.1333	0.992
DFCAN	-3.3667	0.9992
SwinIR	-29.9667	<.0001
ENL-CN	-3.7	0.9975
GRL	-14.7667	0.014
ACT	-7.7	0.5677
Omni-SR	-4.0667	0.9932
DBPN	-0.6333	1
SRFBN	-19.3667	0.0003
ProSR	-0.8333	1
MS-LapSRN	-17.8333	0.0011

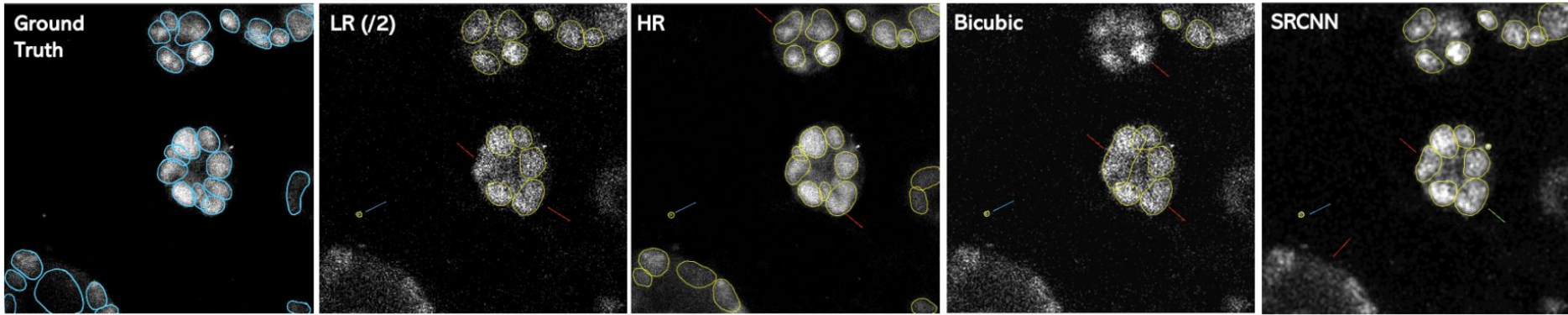
Figure 6: Analysis of cell detection performance for CELL2, X2 over 30 random test samples (red dots). More results can be found in the supplementary materials.

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SR-CACO-2: Usage

Microscopy downstream tasks over cells

Segmentation Error																	Mean %			
CELL0	Oversegmentation	8.14	2.3	2.2	5.21	18.2	14	4.07	10	7.92	NA	11.4	6.49	8.34	9.98	12	11.5	3	4.57	40 30 20 10 0
	Undersegmentation	10.2	29.9	35.4	25.5	9.34	10.5	32.8	12	15.2	NA	14.1	19.3	13.5	13.3	12.7	13.8	32.8	29.5	
CELL2	Oversegmentation	7.78	2.82	2.42	7.29	9.1	8.08	3.92	8.32	7.22	10.5	8.07	8.72	7.32	7.92	9.9	7.26	3.37	4.22	
	Undersegmentation	10.7	27.7	35.6	22.5	11.7	14.6	33.4	15.2	16.2	19.5	15.4	13	15.5	16.3	15.1	16.6	32.5	30.2	
		HR	LR	Bicubic	SRCNN	VDSR	DRPN	MemNet	NLSN	DPCAN	SwinIR	ENLGN	GRL	ACT	Omni-SR	DBPN	SRRFBN	ProSR	MS-LapSRN	
		No model		Pre-upsampling SR				Post-upsampling SR					Iterative up-and-down sampling SR		Progressive upsampling SR					



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SR-CACO-2



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See you at the poster!