

Contributions

- A comprehensive study on the effectiveness of localized retrieval for instance-level matching
- LocScore enables evaluation beyond AP by measuring spatial alignment.
- Structured patch-based retrieval provides a strong baseline for studying localized retrieval.
- Experiments uncover practical design factors such as region granularity, window size, and feature budget.
- Strong performance can be achieved with only a handful of structured patch features under realistic memory constraints.

LocScore: Localization-aware Metrics

(a) Continuous LocScore

$$LocScore = \frac{1}{N} \cdot \frac{1}{I_n} \sum_{n=1}^N \sum_{i=1}^{I_n} \frac{h^{n,i}}{r^{n,i}} \cdot IoU(B_{gt}^{n,i}, B_{pred}^{n,i})$$

(b) Discrete LocScore

$$LocScore(\delta) = \frac{1}{N} \cdot \frac{1}{I_n} \sum_{n=1}^N \sum_{i=1}^{I_n} \frac{h^{n,i}}{r^{n,i}} \cdot \mathbb{I}[IoU(B_{gt}^{n,i}, B_{pred}^{n,i}) \geq \delta]$$

I_n : # of GT positives for query n

$r_{n,i}$: Rank position of the retrieved GT images

$h_{n,i}$: # of true positives retrieved within top- $r_{n,i}$

• (a) Measures **retrieval quality** with **spatial awareness**.

• (b) further enables **user-controllability** with the notion of “good localization”.

Effect of IoU Threshold on Discrete LocScore

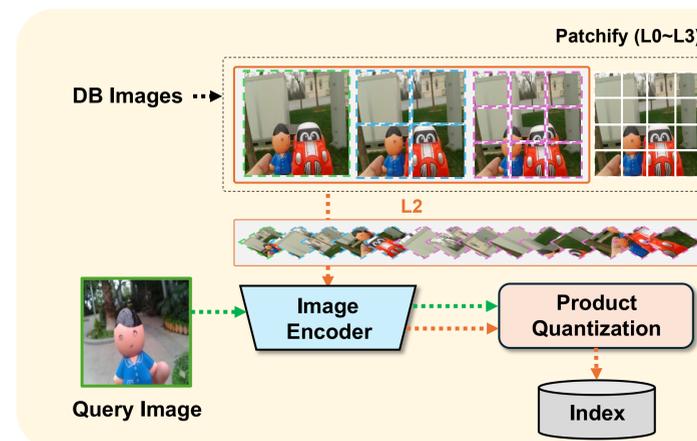


Threshold	Top 1	Top 3	Top 4	Top 7	LocScore(δ)
$\delta = 0.3$	X	✓	✓	✓	0.50
$\delta = 0.4$	X	X	✓	✓	0.33
$\delta = 0.5$	X	X	✓	X	0.19
✓: Pass (IoU $\geq \delta$)	X: Fail (IoU $< \delta$)				

	Top 1	Top 3	Top 4	Top 7	LocScore(cont.)
IoU	0.174	0.391	0.533	0.461	0.390

Correct Wrong Predicted Patch G.T. bbox

Patchify: Localized Retrieval Baseline



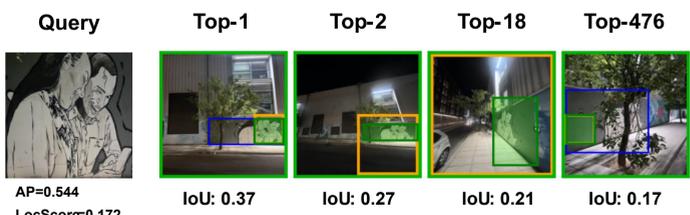
Directly applicable to strong pretrained backbones without fine tuning!

- Structured multi-scale patch representation (L0-L3).
- Patch-level matching with max-similarity scoring for image ranking.

A Bag of Practical Findings

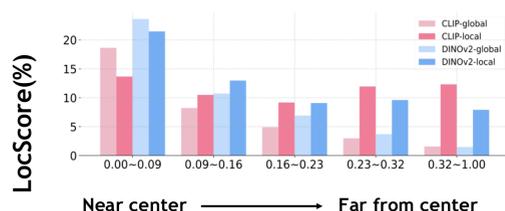
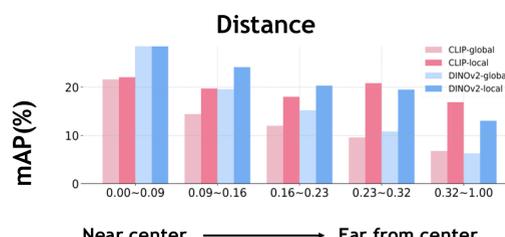
High AP Does Not Guarantee Correct Localization

Correct Predicted Patch G.T. bbox



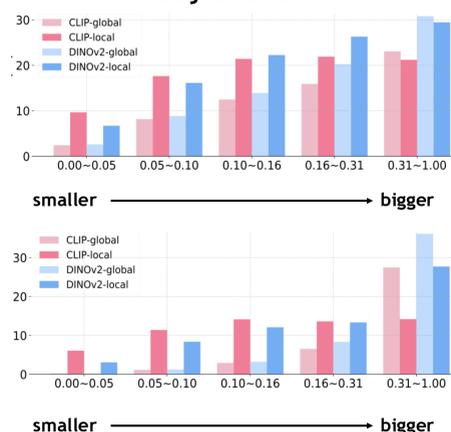
- Both examples achieve perfect ranking performance.
- However, their predicted regions show very different spatial overlap with the target.
- AP measures which images are retrieved, while LocScore further evaluates how well they are spatially aligned.

Local Features Help for Small and Off-Center Objects



- **Global representations** blur localized evidence, **failing to capture small or off-center objects** accurately, and **more distracted**.
- **Patch-based(local patch matching)** retrieval **preserves spatial cues**, enabling more robust localization and consistent performance.

Object Size



Spatial Granularity Alone Is Not Enough

Method (L3 setting)	INSTRE		ILIAS	
	mAP	LocScore (%)	mAP	LocScore
Global	78.48	18.92	55.03	14.31
Patchify	87.01	24.29	65.16	19.75
Sliding Window (0.5)	89.26	27.50	68.24	22.36
Sliding Window (0.25)	90.62	29.87	70.02	24.57
Region Proposal	92.96	71.44	84.19	68.23

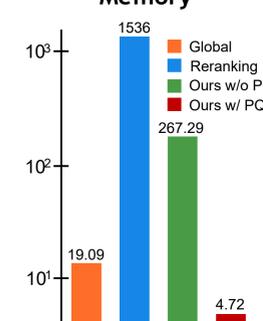
- Retrieval performance increases with finer region granularity.
- However, gains diminish with overly dense sampling.
- Sliding window results suggest that increasing spatial coverage alone is insufficient.
- Region proposal results further indicate that both window size and region granularity are critical for optimal performance.

Competitive Localized Retrieval with a Handful of Features

(on Mini-ILIAS)

Method	mAP@1k	Method	mAP@1k
Global feature		Reranking (AMES)	
DINOv2 [†]	18.80	DINOv2 [†]	26.50
SigLIP2 [†]	37.30	OpenCLIP [†]	32.90
DINOv3	21.80	DINOv3	29.86
+ Patchify (L3)	42.98	+ Patchify (L3)	50.72
SigLIP	20.41	SigLIP	26.99
+ Patchify (L2)	50.27	+ Patchify (L2)	56.54
SigLIP [†]	33.86	SigLIP [†]	40.91
+ Patchify (L3)	40.48	+ Patchify (L3)	48.21

Memory



- Patchify provides strong first-stage retrieval performance.
- It integrates effectively with reranking pipelines using only a handful of features.
- With Product Quantization, memory usage remains comparable to global search and significantly lower than dense local reranking methods.
- **Patchify strikes a practical balance between accuracy, scalability, and efficiency.**
- **Patchify provides a strong and practical starting baseline for localized retrieval!**