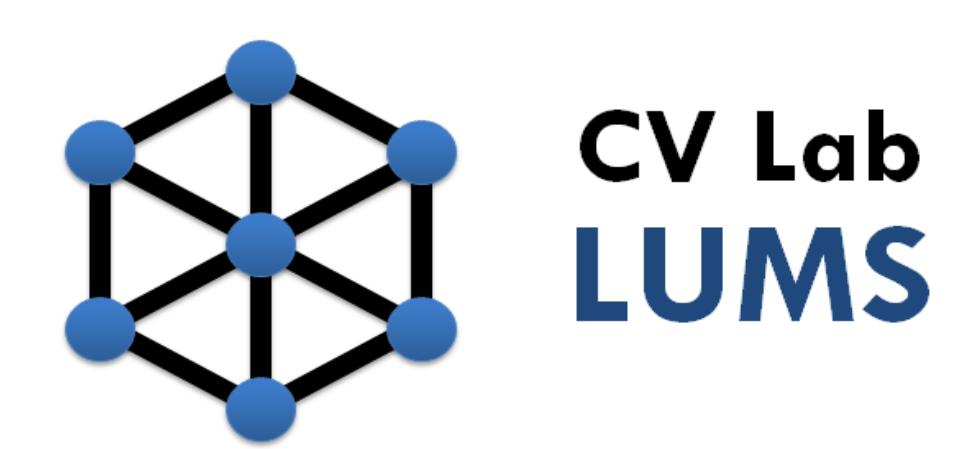


DIMENSIONALITY REDUCTION USING DISCRIMINATIVE AUTOENCODERS FOR REMOTE SENSING IMAGE RETRIEVAL



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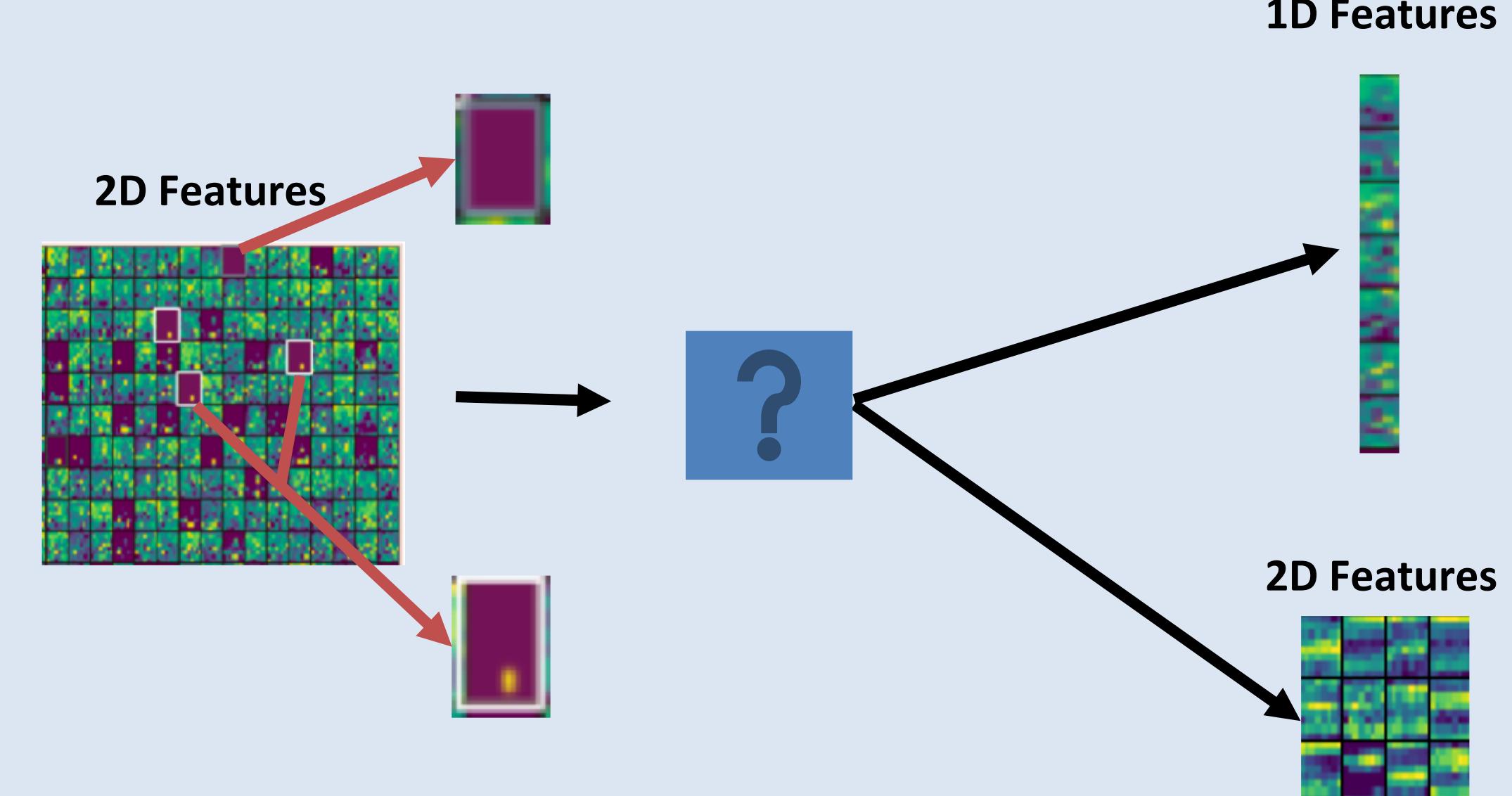
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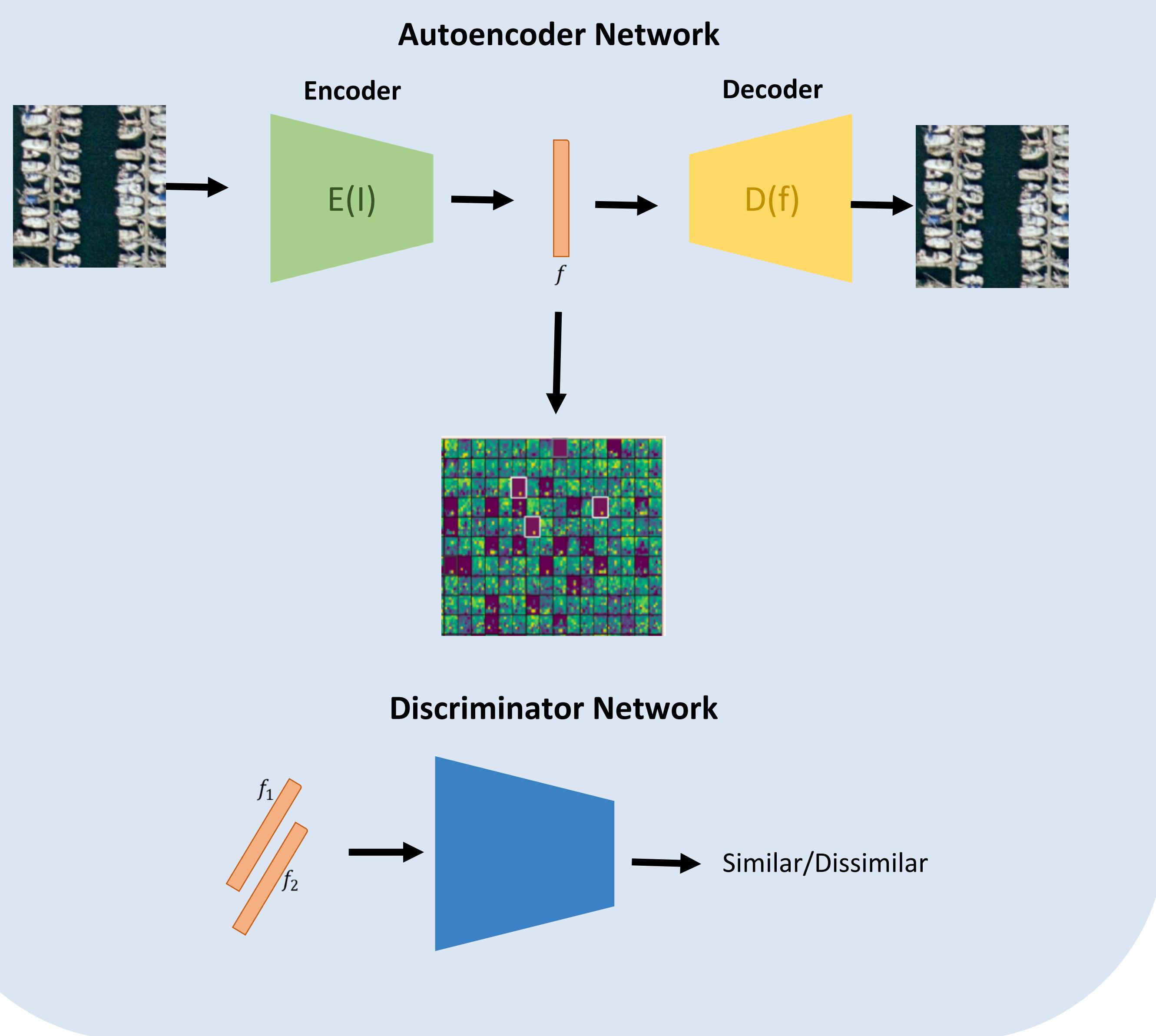
1 Motivation

- Lack of annotated data for Remote Sensing Images.
- Feature extraction using deep unsupervised methods results in large feature size as some filters could be redundant.
- Current feature reduction schemes aggregate learned visual descriptors leading to loss of information

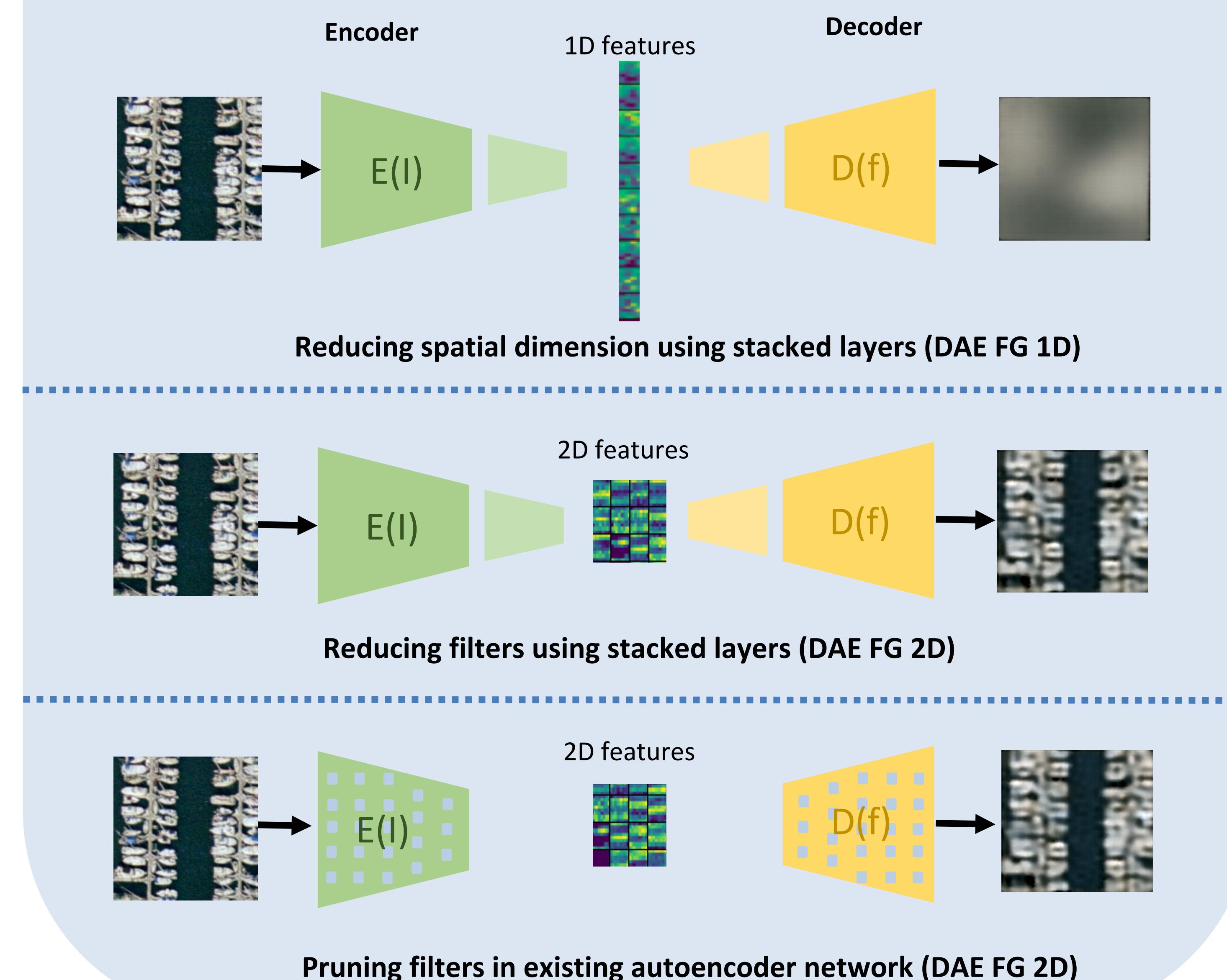
How to reduce features redundancy?



2 Discriminative Autoencoder (DAE CG)



3 Dimensionality Reduction



4 Results

$$mAP = \frac{1}{Q} \sum_{q=1}^Q AP(q)$$

$$NMRR = \frac{Rank_{mean}(q) - 0.5 [1 + G(q)]}{1.25 K(q) - 0.5 [1 + G(q)]}$$

$$ANMRR = \frac{1}{Q} \sum_{q=1}^Q NMRR$$

Q = Set of queries

$G(q)$ = Set of relevant images

Feature Type	Features	Feature Size	ANMRR	mAP	P@5	P@50	P@100
Hand-Crafted	LPB RGB [13]	54	0.751	18.0	58.7	28.1	19.6
	Dense SIFT VLAD [14]	25600	0.649	28.0	74.9	38.2	28.1
	Dense SIFT FV [13]	40960	0.639	29.2	75.3	39.1	28.5
Deep Supervised	NetVLAD [15]	4060	0.406	51.4	83.0	61.6	49.0
	SatResNet [13]	2048	0.239	69.9	92.1	77.2	64.4
Deep Unsupervised	DAE CG	32768	0.09	81.2	100	99.2	87.4
	DAE CG PCA	1063	0.591	24.7	59.6	45.5	39.9
	DAE FG 1D	1024	0.495	38.0	63.1	54.0	49.6
	DAE FG 2D	1280	0.417	43.9	66.7	63.6	57.2

Table 1 Comparative evaluation of our proposed approach on LandUse dataset

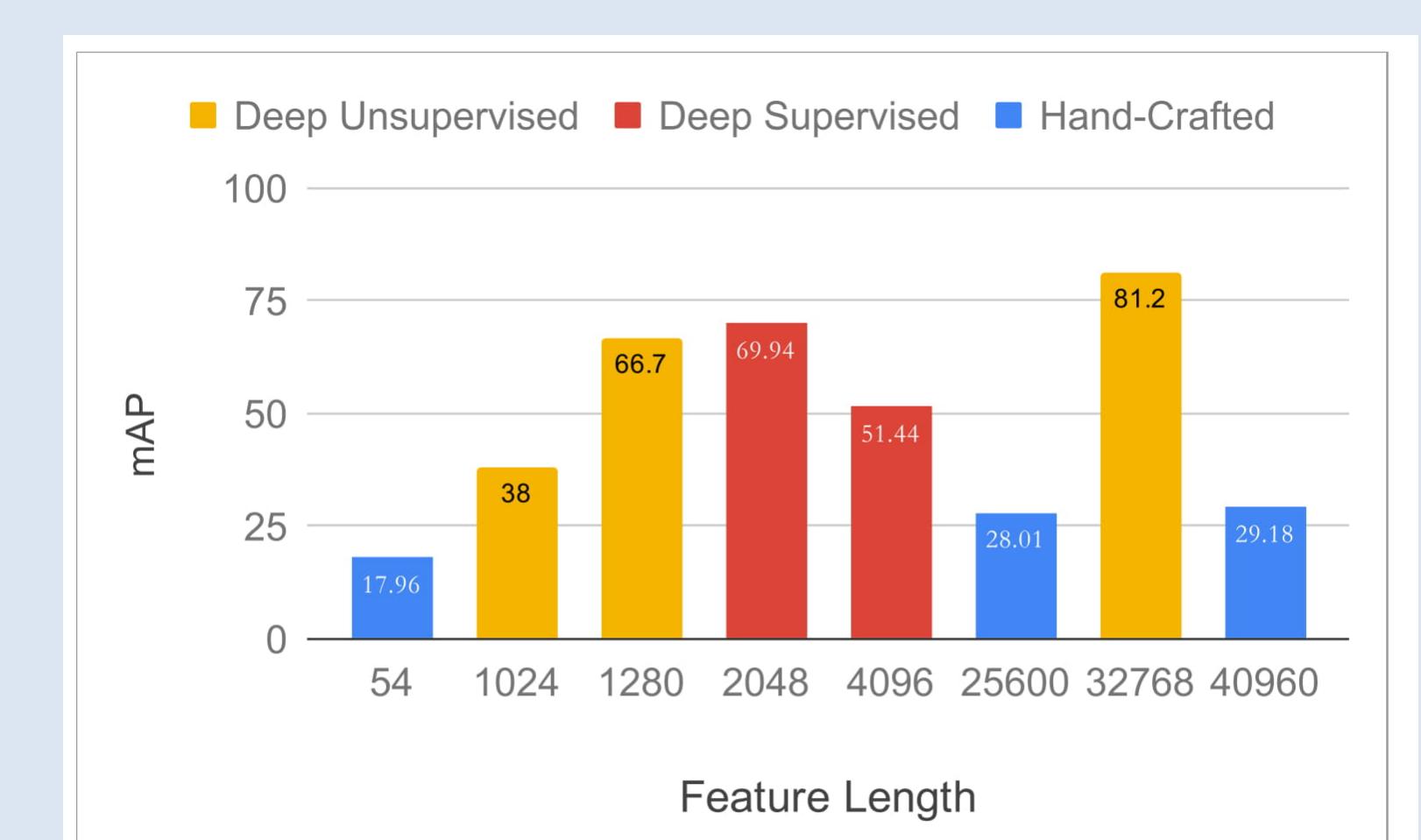


Fig.1 Quantitative Evaluation: Comparison between mAP scores of various methods for LandUse dataset.

Feature Type	Features	Feature Size	ANMRR	mAP	P@5	P@50	P@100
Hand-Crafted	LPB RGB [13]	54	0.664	25.0	50.3	26.3	19.4
	Dense SIFT VLAD [14]	25600	0.649	28.0	74.9	4.20	28.1
	Dense SIFT FV [13]	40960	0.552	35.9	71.3	36.2	25.0
Deep Supervised	NetVLAD [15]	4060	0.371	56.4	82.5	64.4	52.2
	SatResNet [13]	2048	0.207	74.2	92.1	80.9	68.0
Deep Unsupervised	DAE CG	32768	0.06	96.6	100	94.3	52.0
	DAE CG PCA	1063	0.473	17.9	65.0	52.1	37.2
	DAE FG 1D	804	0.495	17.1	54.2	51.2	30.4
	DAE FG 2D	1280	0.5	17.6	60.8	50.7	29.9

Table 2 Comparative evaluation of our proposed approach on SatScene dataset

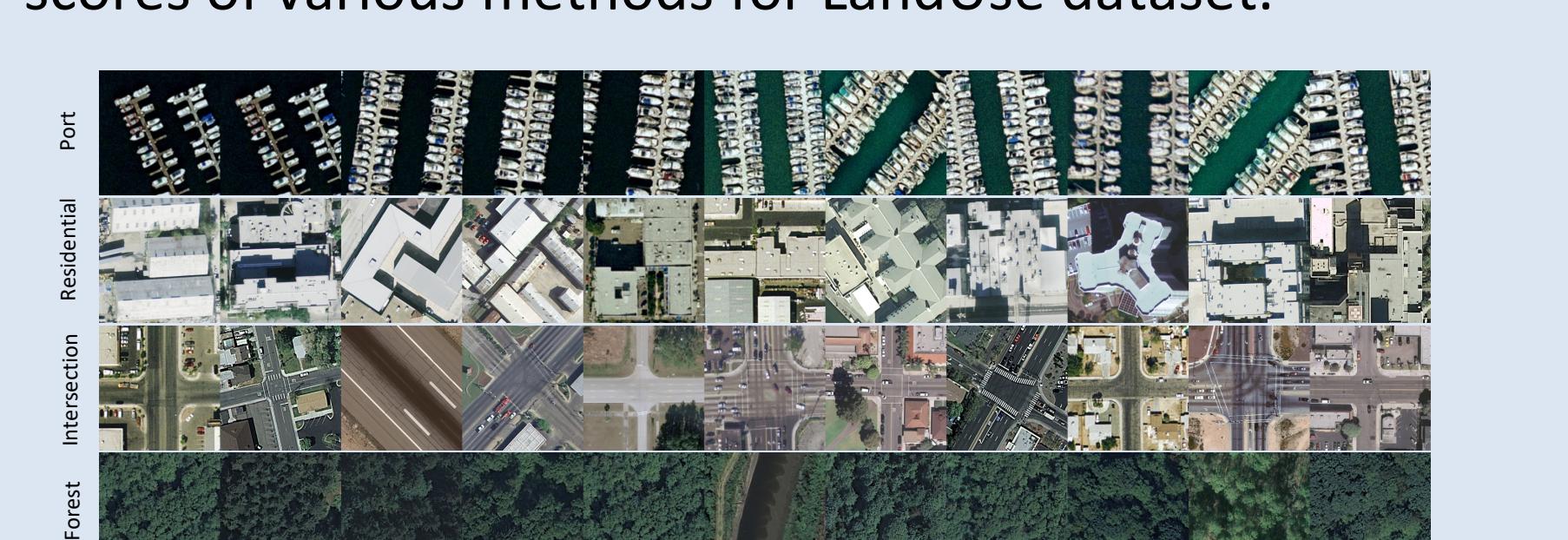


Fig.2 Qualitative Evaluation: Left most is query image and the remaining are top retrieved images.