



Quality Aware Network for Set to Set Recognition

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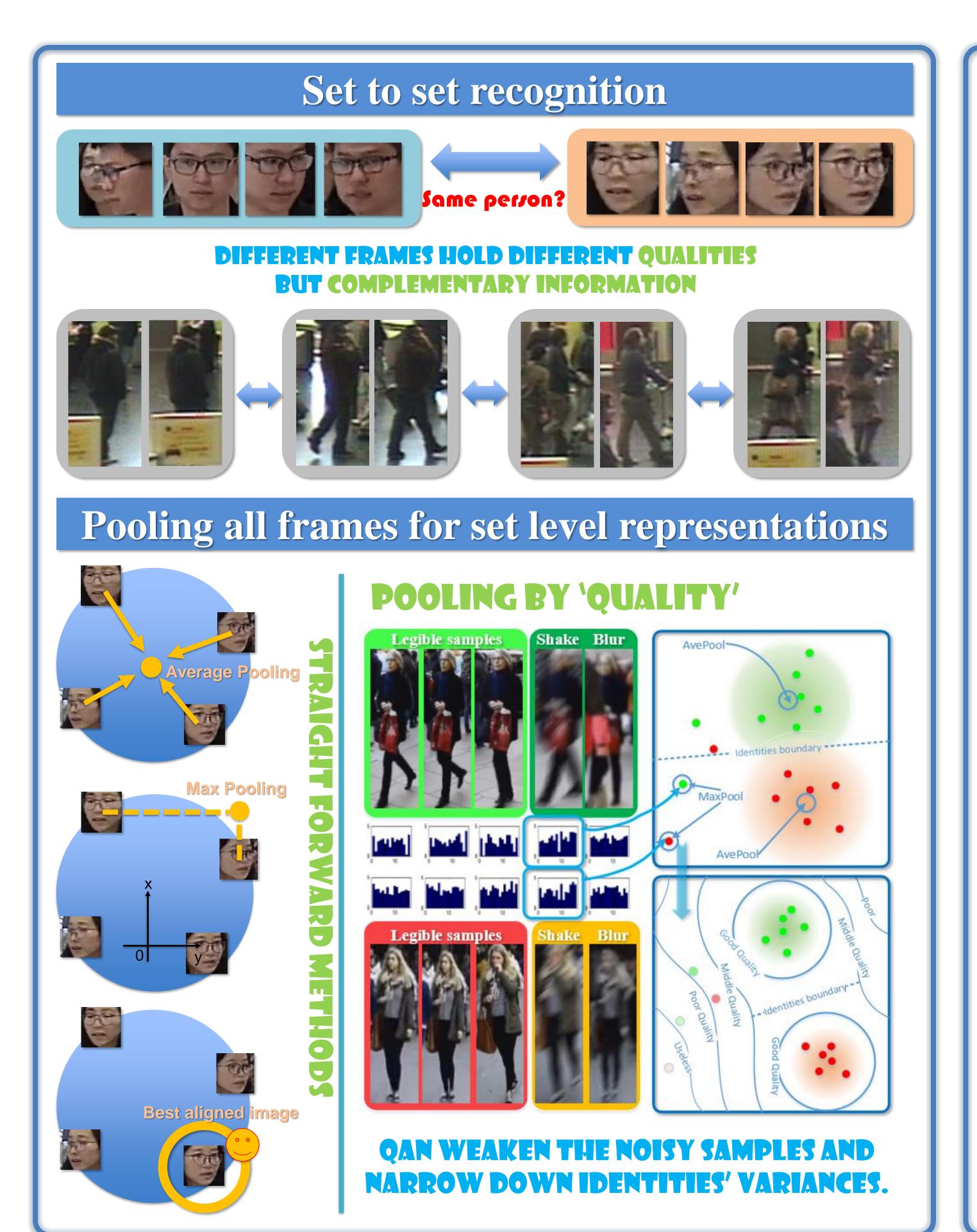
The University of Sydney



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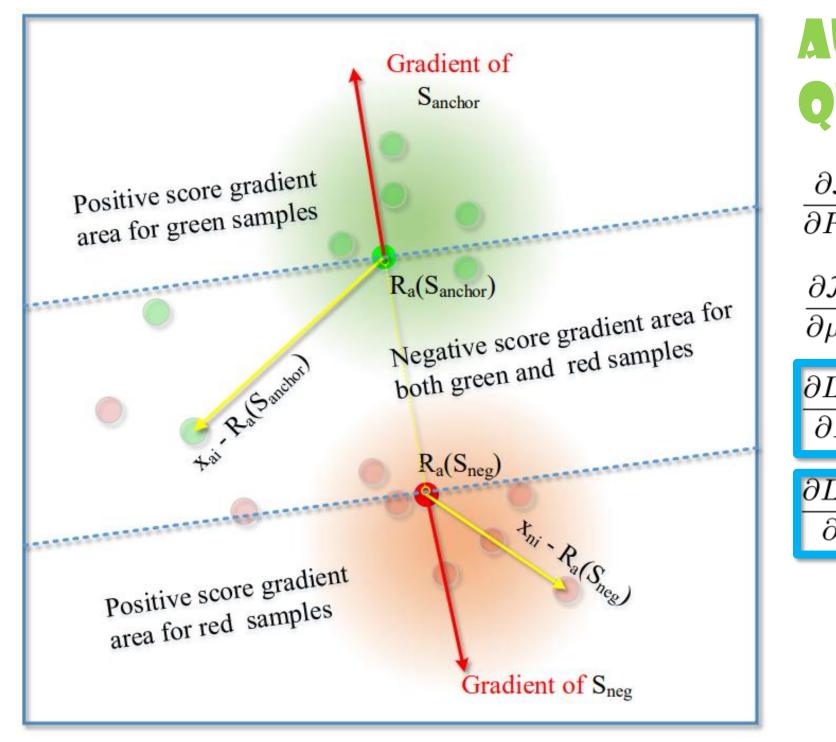
SenseTime Group Limited



Learning Quality without label

WEIGHTED POOLING MECHANISM

$$\mathcal{F}(R_{I_1}, R_{I_2}, \cdots, R_{I_N}) = \frac{\sum_{i=1}^N \mu_i R_{I_i}}{\sum_{i=1}^N \mu_i} \quad \mu_i = Q(I_i)$$



QUALITY LEARNING

$$\frac{\partial \mathcal{F}}{\partial R_{I_{i}}} = \frac{\partial R_{a}(S)}{\partial R_{I_{i}}} = \mu_{i}$$

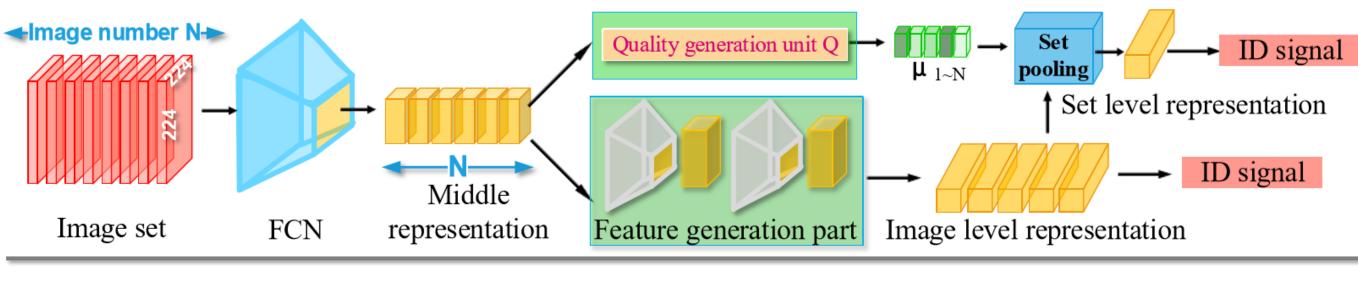
$$\frac{\partial \mathcal{F}}{\partial \mu_{i}} = \frac{\partial R_{a}(S)}{\partial \mu_{i}} = R_{I_{i}} - R_{a}(S)$$

$$\frac{\partial L_{veri}}{\partial R_{I_{i}}} = \frac{\partial R_{a}(S)}{\partial R_{I_{i}}} \cdot \frac{\partial L_{veri}}{\partial R_{a}(S)} = \frac{\partial L_{veri}}{\partial R_{a}(S)} \cdot \mu_{i}$$

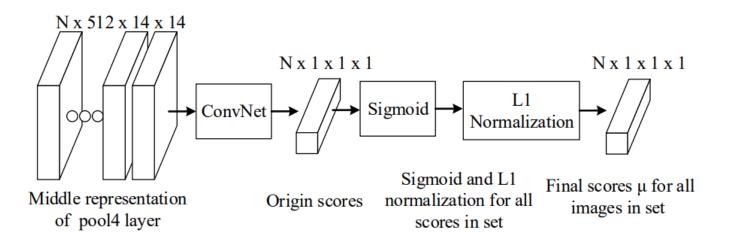
$$\frac{\partial L_{veri}}{\partial \mu_{i}} = \frac{\partial R_{a}(S)}{\partial \mu_{i}} \cdot \left(\frac{\partial L_{veri}}{\partial R_{a}(S)}\right)^{T}$$

$$= \sum_{j=1}^{D} \left(\frac{\partial L_{veri}}{\partial R_{a}(S)_{j}} \cdot (x_{ij} - R_{a}(S)_{j})\right)$$

Network structure

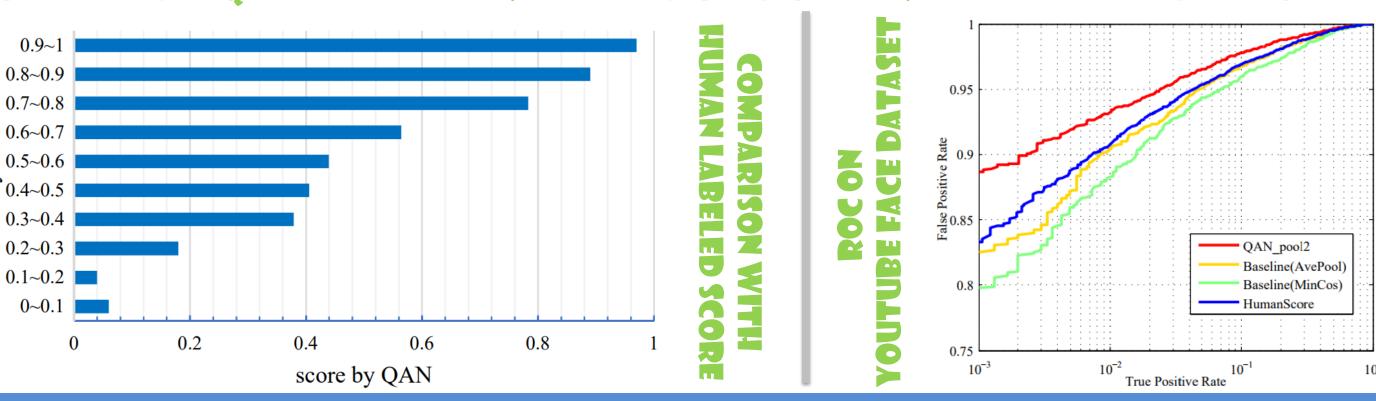


SCORE GENERATION UNIT Q



Quality learned by QAN





Enhancing Acc. on Face and Human recognition

	PRI	D2011		
Methods	CMC1	CMC5	CMC10	CMC2
QAN	90.3	98.2	99.32	100.0
CNN+AvePool	81.3	96.6	98.5	99.6
CNN+Min(cos)	69.8	91.3	97.1	99.8
CNN+RNN [36]	70	90	95	97
STFV3D [22]	42.1	71.9	84.4	91.6
TDL [40]	56.7	80.0	87.6	93.6
eSDC [34]	48.3	74.9	87.3	94.4
DVR [34]	40.0	71.7	84.5	92.2
LFDA [25]	43.7	72.8	81.7	90.9
KISSME [16]	34.4	61.7	72.1	81.0
LADF [21]	47.3	75.5	82.7	91.1
TopRank [19]	31.7	62.2	75.3	89.4

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iLIDS-VID								
lethods	CMC1	CMC5	CMC10	CMC20				
AN	68.0	86.8	95.4	97.4				
NN+AvePool	60.6	84.9	89.8	93.6				
NN+Min(cos)	49.3	79.4	88.2	91.9				
NN+RNN [36]	58	84	91	96				
TFV3D [22]	37.0	64.3	77.0	86.9				
DL [40]	56.3	87.6	95.6	98.3				
SDC [34]	41.3	63.5	72.7	83.1				
VR [34]	39.5	61.1	71.7	81.0				
FDA [25]	32.9	68.5	82.2	92.6				
ISSME [16]	36.5	67.8	78.8	87.1				
ADF [21]	39.0	76.8	89.0	96.8				
opRank [19]	22.5	56.1	72.7	85.9				

96.17± 0.09% 99.14± 0.12% CNN+AvePoo CNN+Min(cos $94.87 \pm 0.10\%$ $95.52 \pm 0.06\%$ FaceNet [26] $95.12 \pm 0.39\%$ DeepID2+ [29] $93.2 {\pm} 0.2\%$

DeepFace-single [

 $84.8 \pm 1.4\%$

PERSON RE-IDENTIFICATION

ERTIFICA	TION		I-JBA
TPR@FPR	1e-3	1e-2	1e-1
QAN	89.31±3.92%	94.20±1.53%	98.02±0.55%
CNN+AvePool	85.30±3.48%	93.81 ± 1.44	$97.85 \pm 0.61\%$
CNN+Min(cos)	82.74±3.61%	92.06±1.98	$97.29 \pm 0.67\%$
NAN [38]	78.5±2.8%	89.7±1.0%	95.9±0.5%
OCNN+metric [4]	-	$78.7 \pm 4.3\%$	$94.7 \pm 1.1\%$
LSFS [31]	51.4±6.0%	$73.3\pm3.4\%$	89.5±1.3%
OpenBR [15]	$10.4 \pm 1.4\%$	23.6±0.9%	43.3±0.6%