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[Continued on next page]

## (54) Title: FAST SUBSPACE PROJECTION OF DESCRIPTOR PATCHES FOR IMAGE RECOGNITION

Obtain a matrix of gradients X for a set of N patches. Obtain an autocorrelation matrix S for the N patches, such that S = (1/N) XX<sup>T</sup>. For i = 1 to # of basis vectors: For i≠ 1: Project autocorrelation matrix S to a null space for a previous vector subspace such that  $S = S - K\alpha^{i-1}\alpha^{i-1}^T KSK \alpha^{i-1}\alpha^{i-1}^T K$ to # of radomizations; Calculate the eigenvector and eigenvalue that maximize variance of S in the subspace spanned by the coefficients:  $K^{-1}SK \alpha = \alpha \lambda_r$ Select the current eigenvector  $\alpha^{i} = \alpha^{max}$  that has the maximum variance over all the randomization =max, α · = Add  $\alpha_i$  to sparse coefficent matrix  $A=\{\alpha^1, ..., \alpha^i\}$ 

> Exemplary Method for Variance Maximization FIG. 8

(57) Abstract: A method for generating a feature descriptor is provided. A set of pre-generated sparse projection vectors is obtained. A scale space for an image is also obtained, where the scale space having a plurality scale levels. A descriptor for a keypoint in the scale space is then generated based on a combination of the sparse projection vectors and sparsely sampled pixel information for a plurality of pixels across the plurality of scale levels.

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## **Declarations under Rule 4.17**:

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- as to the applicant's entitlement to claim the priority of the earlier application (Rule 4.17(iii))

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C. DOCUME	NTS CONSIDERED TO BE RELEVANT					
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X Furth	ner documents are listed in the continuation of Box C.	See patent fami	ily annex.			
"A" docume consid "E" earlier of filing d "L" docume which incitation "O" docume other r "P" docume later th	ant defining the general state of the art which is not ered to be of particular relevance locument but published on or after the international atte in the work of the state of the state of the stablish the publication date of another or other special reason (as specified) ent referring to an oral disclosure, use, exhibition or means on the special reason for the sp	cited to understand invention "X" document of particul cannot be consider involve an inventive "Y" document of particul cannot be consider document is combined.	not in conflict with to a the principle or the lar relevance; the clared novel or cannot be step when the doc lar relevance; the clared to involve an invened with one or mornation being obvious of the same patent for	the application but ory underlying the aimed invention be considered to sument is taken alone aimed invention entive step when the re other such docusts to a person skilled		
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