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Datasheet for the decision of 20 March 2023

Case Number: T 0814/20 - 3.5.06

Application Number: 15195657.0

Publication Number: 3035239

IPC: G06K9/00

Language of the proceedings: EN

Title of invention:

ADAPTED VOCABULARIES FOR MATCHING IMAGE SIGNATURES WITH FISHER **VECTORS**

Applicant:

Conduent Business Services, LLC

Headword:

Adapted Visual Vocabularies/CONDUENT

Relevant legal provisions:

EPC Art. 56, 84, 123(2)

Keyword:

Inventive step - technical purpose - effect made credible within the whole scope of claim (yes)

Decisions cited:

G 0001/19

Catchword:



Beschwerdekammern Boards of Appeal Chambres de recours

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Case Number: T 0814/20 - 3.5.06

DECISION
of Technical Board of Appeal 3.5.06
of 20 March 2023

Appellant: Conduent Business Services, LLC

(Applicant) 2828 North Haskell Avenue

Building 1, Floor 9 Dallas, TX 75204 (US)

Representative: Gill Jennings & Every LLP

The Broadgate Tower 20 Primrose Street London EC2A 2ES (GB)

Decision under appeal: Decision of the Examining Division of the

European Patent Office posted on 20 September 2019 refusing European patent application No. 15195657.0 pursuant to Article 97(2) EPC.

Composition of the Board:

Chairman M. Müller
Members: T. Alecu
B. Müller

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Summary of Facts and Submissions

- I. The appeal is against the decision of the Examining Division to refuse the application. With the grounds of appeal the Appellant requested that the decision of the Examining Division be set aside and that a patent be granted on the basis of a main request, which was identical to the main request underlying the appealed decision, or on the basis of one of five auxiliary requests.
- II. In its decision, the Examining Division denied novelty or inventive step of all requests in comparison with document

D3: EP 2 065 813 A1, also in view of

D4: SANCHEZ JORGE ET AL: "Image Classification with the Fisher Vector: Theory and Practice".

It further found a lack of support (Article 84 EPC) and an extension beyond the content of the application as originally filed (Article 123(2) EPC) for the first auxiliary request underlying its decision.

III. In a communication accompanying a summons to oral proceedings the Board provided its provisional opinion that, for all requests, an inventive step could not be acknowledged for the subject matter of claim 1 because it did not provide a technical contribution to the art, Article 56 EPC. The Board also considered that the main and the first three auxiliary requests lacked support, Article 84 EPC, and that the second to fifth auxiliary requests did not comply with Article 123(2) EPC.

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- IV. With its reply of 13 February 2023, the Appellant submitted several auxiliary requests.
- V. The Board indicated with its communications of 1 March 2023 and 6 March 2023 that the application could be allowed to proceed to grant on the basis of a request labeled C4, but that further amendments to the claims and the description were necessary for the application to be compliant with the requirements of Articles 84 (clarity, conciseness and determination of the protection sought) and 123(2) EPC.
- VI. In response, the Appellant provided a first version of an amended set of claims on 3 March 2023 and a full request including claims and description on 7 March 2023. This request replaced all requests on file "subject to the Board of Appeal remitting the case to the Examining Division with an order for grant".

VII. Claim 1 of this request defines:

A method for object re-identification comprising: providing a universal generative model of local descriptors;

adapting the universal generative model to a first camera to obtain a first camera-dependent generative model;

adapting the universal generative model to a second camera to obtain a second camera-dependent generative model or using the universal generative model as the second camera-dependent generative model; from a first image of a first object captured by the first camera, extracting a first image-level descriptor

using the first camera-dependent generative model, said first image-level descriptor being a Fisher Vector;

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from a second image of a second object captured by the second camera, extracting a second image-level descriptor using the second camera-dependent generative model, said second image-level descriptor being a Fisher Vector;

computing a similarity between the first image-level descriptor and the second image-level descriptor; and outputting information based on the computed similarity, wherein:

if the computed similarity at least meets a threshold, the information comprises an indication that the first object and the second object match; or

if the computed similarity is lower than the threshold, the information comprises an indication that the first object and the second object do not match;

wherein at least one of the adapting the universal generative model to the first and second cameras, extracting the first and second image-level descriptors and the computing of the similarity is performed with a computer processor;

wherein the adapting of the universal generative model to the first and second cameras comprises extracting local descriptors from images captured by the first and second cameras, the local descriptors from the images captured by the first camera being used to adapt the universal generative model to the first camera, the local descriptors from the images captured by the second camera being used to adapt the universal generative model to the second camera; wherein the universal generative model is a Gaussian Mixture Model and the adapting of the universal generative model to each camera comprises a two-step Expectation—Maximization iterative process, each iteration of said two-step Expectation—Maximization iterative process

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comprising, for each camera-dependent generative model:

- (1) computing, for each Gaussian in the Gaussian Mixture Model, an estimate of the number of n_k points assigned to said Gaussian, an estimate of the mean m_k of all points assigned to said Gaussian, and an estimate of the variance s_k of all points assigned to said Gaussian; and
- (2) updating the mixture weight, mean vector, and covariance matrix of each Gaussian using said estimated number of points assigned to said Gaussian, the estimated mean of all points assigned to said Gaussian, and the estimated variance of all points assigned to said by:

for the mixture weight:

$$\hat{\pi}_k^c = \left[\tau_k^\pi \frac{n_k}{N_c} + (1 - \tau_k^\pi) \pi_k \right] \alpha$$

for the mean vector:

$$\hat{\mu}_{k}^{c} = \tau_{k}^{\mu} m_{k} + (1 - \tau_{k}^{\mu}) \mu_{k}$$

for the covariance matrix:

$$\hat{\sigma}_{k}^{c} = \tau_{k}^{\sigma} s_{k} + (1 - \tau_{k}^{\sigma})(\sigma_{k}^{2} + \mu_{k}^{2}) - (\mu_{k}^{c})^{2}$$

wherein π_k , μ_k , and σ_k are respectively the weight, mean vector, and covariance matrix of the k-th Gaussian, τ_k^ρ are the adaptation parameters for each parameter $\rho \in \{\pi, \ \mu, \ \sigma\}$ given by $\tau_k^\rho = n_k/(n_k + r^\rho)$ where r^ρ is a design parameter, N_c is the number of local descriptors extracted from images captured by the corresponding camera, and α is a parameter recomputed over all Gaussians such that $\sum_k \pi_k^c = 1$ holds true; wherein $^{\wedge}\pi_k^c$, $^{\wedge}\mu_k^c$ and $^{\wedge}\sigma_k^c$ are respectively the weight, mean vector, and covariance matrix of the k-th Gaussian of the camera-dependent generative model.

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Reasons for the Decision

The application

- 1. The application relates to a method of image processing. The context is that of re-identification, i.e. the matching of an object in an image to a previously seen object, such as a vehicle in traffic surveillance (paragraphs 2 and 3).
- 1.1 These images may come from different cameras operating under different imaging conditions, for instance lighting. Image representations may be "shifted" as a function of these varying conditions (paragraphs 3-5 and 27). To account for this, the application proposes to start from a universal generative model in the form of Gaussian Mixture Model (GMM) and to adapt it (through e.g. a MAP adaptation process) to individual cameras (paragraphs 27, 36-38, and 71-101).
- 1.2 As opposed to building dedicated models for each camera from scratch, this has the advantage that the different components of the generative model (the Gaussians) are in known correspondence. An image representation based on the generative model and maintaining this component correspondence, like the Fisher Vectors, allows the image matching to be performed in a simple manner, component by component (paragraph 82).
- 1.3 Results are provided in a context of license plate matching using images from different cameras in parking areas (paragraphs 106-118).

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The prior art

- 2. Document D3 describes a method wherein a GMM universal model is adapted to a first and a second image (using MAP adaptation), and then the two probability models are compared component by component to derive a similarity measure between the two images (paragraphs 15 to 17, 26). This similarity metric is used for object classification purposes (paragraphs 40 to 44).
- 3. Document D4 discusses the Fisher Vector image representation. Inter alia, it explains that this representation, defined on the basis of the gradient of the likelihood of the test data (image patch statistics) given the GMM, bears a close relationship with the MAP adaptation procedure of a GMM to a given single image (section 2.5, around equations 35 to 37).

Objections as to support and added matter

- an objection of a lack of support and one of added matter in respect of auxiliary request 1 underlying its decision, stating that "the solution to the problem of object matching (re-identification) announced in par.2 requires image similarity computation", for which the Fisher Vector representation was essential, and further that "in technical terms, the only combination that the skilled person reads directly and unambiguously as having the essential features of the invention is that of MAP adaptation and FVs."
- 5. The Board's objections as to a lack of support were essentially the same.

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- 6. The current claim 1 defines image similarity computation on the basis of Fisher Vectors and MAP adaptation of the GMM models. The objections therefore no longer apply.
- 7. The Board found added matter in the definition of the MAP adaptation, considering the (previously) claimed generalizations to lack basis in the description. This objection has been overcome by amendment in the last (current) set of claims.

Other objections under Article 84 EPC

8. In its last two communications, the Board further raised a number of objections under Article 84 EPC regarding the dependent claims (conciseness and clarity) and the description, which required adaptation. These have been overcome by amendment.

Novelty

- 9. In establishing the equivalence with D3 (decision 1.1. to 1.5), the Examining Division considered that the adaptation to a first and second camera was anticipated by the application of the teachings of D3 to a video object. Further it considered that the first and second image might be ones already used during adaptation, and that the image descriptor was the result of the adaptation, i.e. the mixture model. Under this interpretation "a difference in concrete technical terms" could not be identified on the basis of the further step of extracting image-level descriptors using the adapted models (decision 1.4).
- 10. The Board does not find this to be a technically reasonable interpretation of the claim.

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- 10.1 For the skilled person, the claim recites a standard sequence comprising a "training" phase, when the models are adapted, and a "use" phase, when the already adapted models are used to provide descriptors for test images. This is clear from the wording of the claim, by itself and in the context of the description (see figure 2A). Thus, even if the adapted generative models themselves may be considered image (or video) descriptors, a further step of extracting an image-level descriptor from an image using the adapted models is not derivable from D3.
- 10.2 At least for this reason the subject matter of claim 1 is new in view of D3.

Inventive step

Technical effect

- 11. In its preliminary opinion, in view of the requests on file at that time, the Board indicated that a technical effect, in the sense of obtaining predictable results for image matching could not be acknowledged.
- In particular, although the description disclosed evidence that object matching was improved in the specific context of license plate identification, the claims could not profit from this disclosure since they were not limited to this context. The claims only specified measuring image similarity, which purpose was vague (images may be deemed similar for vastly different reasons, e.g. similar luminosity, or, as here, containing the same objects), and could not be said to serve a technical purpose in the absence of any claimed further technical use.

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- 12. Current claim 1 defines a method for the re-identification of objects captured by image cameras. The Board considers this to be a technical purpose, because it is tantamount to an objective measurement in physical reality: is the object observed now the same as the one observed earlier?
- 13. It remains to be appreciated whether the claimed method provides a technical effect over substantially the whole scope of the claim (see G 1/19, reasons 82).
- 13.1 The claim defines that two objects, based on two images taken by two respective cameras, match if their similarity, computed using Fisher Vectors descriptors from adapted GMMs, is above a threshold.
- The description explains that the method aims at compensating for different imaging conditions, by reflecting the shift in conditions (e.g. illuminations or camera angles) by a corresponding shift in the adapted GMM models (paragraph 27). The description also shows that in a case concerning license plate re-identification in parking facilities using in-house datasets the MAP adaptation claimed provides an improvement over a baseline no-adaptation method (paragraphs 111 to 116). The Board has no reason to doubt these results.
- 13.3 The theoretical assumptions appear sound to the Board. Variations in illumination and geometry should be captured by the mixture model, and this is confirmed by the license plates example. In principle, the method should also provide improved results for other object matching cases, where the imaging conditions between two cameras differ in a similar manner.

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- The claimed method will not "work" under all imaginable circumstances. It is probably safe to say that no computer vision method does. For instance, the present method may fail to re-identify objects largely changing appearance. However, the skilled person will understand, from the present claims and the description, the kind of situations and its parameters (such as illumination and geometry) for which the method is designed. The method credibly works over that range of situations.
- 13.5 In the Board's judgment, this is sufficient to satisfy the requirement that, in the present case, a technical effect is present over substantially the whole scope of the claims (see again G 1/19, reasons 82).

Obviousness

- 14. The Examining Division acknowledged in regard of the second auxiliary request underlying the decision, see point 5, that an additional step of extracting Fisher Vectors was not disclosed in D3, but stated that it would be obvious in the context of D3 to add a step of extracting Fisher Vectors as an image descriptor.
- 15. In this respect the Board agrees with the appellant that, starting from D3, even in view of D4, it is not obvious to add a step of Fisher Vector extraction.
- This is because, in D3, the adapted GMM themselves are considered to accurately describe one image. The Fisher Vectors are described in D4 rather as replacements to the image based MAP adaptation previously developed, because they capture the same information as that

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obtained by adaptation starting from the same GMM (see point 3 above).

- In D3, the MAP adaptation provides the object descriptor; in the application, the MAP adaptation provides camera invariance for the model (encoding the shift in conditions), and the single image object descriptor is provided by the Fisher Vectors derived from the model. Such use of adaptation to provide camera invariance is neither described, nor hinted at, by D3.
- 15.3 Thus, in the Board's view, the skilled person, starting from D3, may have considered Fisher Vectors to measure image similarity for classification purposes instead of the MAP adaptation method, but would not combine the two in the claimed manner.
- 15.4 Thus the claimed matter is not obvious in view of the prior art at hand.
- 16. In view of the foregoing, the Board concludes that the subject matter of claim 1 involves an inventive step in the sense of Article 56 EPC.

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Order

For these reasons it is decided that:

- 1. The decision under appeal is set aside.
- 2. The case is remitted to the first instance with the order to grant a patent on the basis of the following documents:
 - a) claims 1-4 as filed on 7 March 2023;
 - b) description pages 1-32 as filed on 7 March 2023;
 - c) drawings sheets 1-6 as originally filed.

The Registrar:

The Chairman:



L. Stridde Martin Müller

Decision electronically authenticated