# Consistency Check of Image Databases 

Szabolcs Sergyán, László Csink<br>John von Neumann Faculty of Informatics<br>Budapest Tech<br>Nagyszombat u. 19, H-1034 Budapest, Hungary<br>\{sergyan.szabolcs, csink.laszlo\}@nik.bmf.hu


#### Abstract

Checking the consistency of image databases is not a completely solved problem. To decide if an image has already been inserted into the database can only be checked by actually looking through the images, or using the textual descriptive keywords attached to the database items. Both the visual checking and the keyword search in a large image database may result in errors. Several methods of content-based image retrieval [3,5,6,9] and image clustering [8] are known that could be used for determining image database consistency. However; most of these have drawbacks and are sensitive for errors. Thus it seems reasonable to develop a robust, relatively fast algorithm that can identify very similar images of a large database, where very similar means that the two images are probably the same, maybe taken in different illumination conditions. The authors present their Matlab solution that has been tested on a database of 250 color flags used in [4].


Keywords: Image Database Consistency, Color Object Recognition

## 1 Introduction

Interest in image databases has grown considerably in the last years. Locating a desired image in a large image database is thus a typical task. Problems with textual image indexing resulted in more and more interest in retrieving images of automatically derived features based on color, texture or shape - Content Based Image Retrieval.

Before effective search in an image databese is performed, it is best to guarantee that the database is consistent in the sense that the same image is included only once, or more precisely, each image contains only one version, or at least the different versions of an image are detected. Consistency of versions is an important issue regarding object-oriented databases [10]. In CAD applications, a database often stores different alternatives of the same object; these databases are called multiversions, otherwise the database is monoversion.

Visual consistency is considered in [11] in a different sense in the framework of multisource visual information processing, with the goal to reduce complexity and to resolve ill-posed problems.

In our contribution we develop a robust method for checking color image database consistency. The experimental database ${ }^{1}$ contains $n=272$ flags, thus the consistency check involves $\mathrm{n}^{*}(\mathrm{n}-1) / 2$ comparisions, so a robust algorithm was selected.

## 2 Project Description

The project is based on the following algorithm. Take an RGB image of the database and convert it to grayscale format [2]. Then, using k-means clustering [1], transform it into a grayscale image having $k=4$ gray values (Figure 1). In the following, identify the connnected regions in the image where the grayvalue is identical. It may be thought that the thus found regions are the regions of the same color in the original image. This is, however, not alwys true, as red and green will be transformed into the same gray value. Color normalization [7] may help in this case, as then normalized red and normalized green will be different.


Figure 1
(a) is the well-known cameraman; (b) is the histogram of (a), the thick lines are the centers of the clusters; (c) is a grayscale image with the 4 grayscale value

Now consider another approach. Transform the RGB image into a socalled indexed image with a palette of 10-20 colors. A connected set of pixels will be called homogeneous if more than $98 \%$ of the pixels have the same indexed color, and the region will be called to be of this color.

[^0]Let us define a similarity metric between two images $f$ and $g$ as follows. Let $r_{f}(1)$, $r_{\mathrm{f}}(2), r_{\mathrm{f}}(2), \ldots, r_{\mathrm{f}}(\mathrm{p})$ denote homogeneous regions of $f$, where $r_{\mathrm{f}}(1)$.area $>r_{\mathrm{f}}(2)$.area $>r_{\mathrm{f}}(3)$.area $>\ldots>r_{\mathrm{f}}(\mathrm{p})$. area, and $p$ is a fixed constant. Denote $r_{\mathrm{f}}(\mathrm{i})$.color the color of the $i$ th region. Then $f$ and $g$ are similar if and only if
$g \approx f$ iff $d_{1}=\sum_{j=1}^{p} \mid r_{f}(j)$.area $-r_{g}(j)$.area $\mid<\varepsilon_{1}$ and
$d_{2}=\sum_{j=1}^{p} \mid r_{f}(j)$.color $-r_{g}(j)$.color $\mid<\varepsilon_{2}$, where $p=\min \left(6, N_{f}, N_{g}\right)$ and
$N_{f}$ is the number of homogen regions in $f$.
There are, however, flags that have several regions of roughly the same size (e.g. Hungarian or Italian flags, that have even the same colors as well, the difference being in the setting of the colors). If we compare two such gflags, then the small variety in the sizes of the color stripes enhances greatly the success of comparision. Therefore, the topology of the color regions also need to be considered.

## 3 Experiments

The test were run on a database containing 272 flags, which were digitally drawn. The flags typically contained no $t$ too many rekatively large homogeneous regions, as well as some smaller objects.

In the first phase we were looking for the optimal choice of $\varepsilon_{1}$ and $\varepsilon_{2}$ (see above). To this aim, for each flag in the database, we found the nearest (nonidentical) flag using the above distance. Then we defined $\varepsilon_{1}$ and $\varepsilon_{2}$ as the minima of the resepctive columns of Table 1.

|  | $\min \left(d_{1}\right)$ | $\min \left(d_{2}\right)$ |
| :--- | ---: | ---: |
| Afghanistan | 0.0004363 | 0.40308 |
| Albania | 0.02696 | 0.0039216 |
| Alderney | 0.12244 | 0 |
| $\vdots$ |  | 0 |
| Yemen | 0 | 0.037163 |
| Zambia | 0.041875 | 0 |
| Zimbabwe | 0.018716 |  |
| Table 1 |  |  |
| Minima of distances |  |  |

Having determined the parameters, the consistency check of the database was possible. Table 2 lists the items in the database to which a similar other item was found.

| No. | Tested flag | Similar item in database | comment |
| :---: | :---: | :---: | :---: |
| 1. | Burma | Myanmar | same flag |
| 2. | Chad | Romania | same flag |
| 3. | CocosIslands | Heard\&McDonaldIslands | same flag |
| 4. | Commonwealth | Kazahstan | they look similar |
| 5. | Congo-Kinshasa | EuropeanUnion | yellow stars on blue, but with different structure |
| 6. | France | FrenchGuiana | same flag |
| 7. | France | Guadeloupe | same flag |
| 8. | France | Martinique | same flag |
| 9. | France | Mayotte | same flag |
| 10. | France | Tromelin | same flag |
| 11. | FrenchGuiana | Guadeloupe | same flag |
| 12. | FrenchGuiana | Martinique | same flag |
| 13. | FrenchGuiana | Mayotte | same flag |
| 14. | FrenchGuiana | Tromelin | same flag |
| 15. | Greenland | Indonesia | they look simililar |
| 16. | Greenland | Monaco | same flag |
| 17. | Greenland | Poland | they look similar |
| 18. | Guadeloupe | Martinique | same flag |
| 19. | Guadeloupe | Mayotte | same flag |
| 20. | Guadeloupe | Tromelin | same flag |
| 21. | Indonesia | Monaco | same flag |
| 22. | Indonesia | Poland | same flag |
| 23. | IsleofMan | Somalia | totally different |
| 24. | Martinique | Mayotte | same flag |
| 25. | Martinique | Tromelin | same flag |
| 26. | Mayotte | Tromelin | same flag |
| 27. | Monaco | Poland | same flag |
| 28. | NewZealand | Tokelau | same flag |
| 29. | NordicCouncil | SouthKorea | they look similar |
| 30. | SaudiArabia | WesternEuropeanUnion | totally different |

Table 2
Result of the consistency check

## 4 Results and Conclusions

According to the test, out of $\binom{272}{2}$ comparisons only in two cases were the results totally wrong (case 23 . and 30 ., Table 2.) Similarities were found in cases $4,5,15,17$ and 29 , which are justified if we look at the flags of the correponding countries.

Identity was found in several cases. In case 1. the reason is that Burma and Myanmar are two fifefrent names of the same country, so this item appears in the database twice. Case 2. is just a coincidence, Chad and Romania simply have the same flag. In cases 6-14, the reason of the same flag is clearly historical.

We think that our robust method is useful for the check of consistency in some image databases, where relatively big, homogeneous color regions are typical. We do not say that our method is error free, but the errors were minimal in the test. Clearly other aspects than color regions could be considered, but then the running time will considerably incerase.

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[^0]:    ${ }^{1}$ http://www.flags.net

