ELABORATION OF THE HIERARCHICAL APPROACH TO SEGMENTATION OF SCANNED DOCUMENTS IMAGES

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The rapid development of digital technologies has led to the conversion into electronic form of all types of materials, including documents from archives, libraries, and enterprises to create electronic archives. An important stage in the processing of images of scanned documents is segmentation, which consists in dividing the image into homogeneous areas that are similar in one feature or set of features.

In the literature, there are 2 main approaches to the segmentation of scanned documents images [1]: descending and ascending. Segmentation methods that use a descending approach [2–4] first determine the objects of a higher level of the page structure – text and graphic elements, and then – columns of text, paragraphs, lines, symbols of text. These methods are characterized by high speed, but low quality segmentation, since it is not always possible to process non-rectangular areas of text or headings that occupy several columns of text. Segmentation methods that use an upward approach to segmentation [5, 6] begin processing with text characters that are combined into paragraphs, paragraphs, and columns. Next, the resulting objects are classified as text areas until the entire text areas are highlighted. These methods are distinguished by high quality segmentation, since they process images with a complex shape well, but have low speed, due to the fact that they require processing of each pixel first, and then the document areas. When digitizing a large number of printed documents, the requirements for the speed of their processing increase. As a consequence, an urgent task, which is solved in this work, is increasing the speed of processing images of scanned documents by reducing their processing time, using a hierarchical approach to image segmentation. Therefore, the aim of research is using a hierarchical approach to the segmentation of images of scanned documents to reduce the processing time of images with sufficient quality segmentation.
selecting text areas, as well as graphic and photo areas from the background.

The existing methods of segmentation of scanned documents images do not simultaneously satisfy the requirements for short processing time with sufficient segmentation quality.

The need for a hierarchical organization of the system is necessary if its implementation requires the expenditure of a large amount of time, which is unacceptable for this system. Therefore, in order to reduce the processing time of a document image in this paper, let’s propose to use a hierarchical approach to the segmentation of images of scanned documents. This approach consists in the representation of an image in the form of a multilevel structure, in which there is a division of the set of its constituent objects into subsets of different levels with the property of integrity [7]. The hierarchical structure allows the processing of individual information arrays. That is, this approach allows processing for each level of image representation. According to the hierarchical approach, the image is first decomposed into areas of illustrations, including both photos and graphics, followed by their classification, as well as areas containing text and background, followed by highlighting text areas from the background. As a result of image segmentation using the proposed approach, the image of the scanned document is presented as separate areas: text, graphics, photo and background. The hierarchical approach is shown in Fig. 1.

According to the hierarchical approach to image segmentation (Fig. 1), the first level corresponds to the original image of the scanned document. As the base model for the representation of this image, the most frequently used model of mixed raster content in literature is Mixed Raster Content [8]. According to this model, the image of the document is represented as an image of a mask, as well as images of the foreground and background. Each of these images contains objects of a certain class and is independently compressed by certain encoders. The mask contains information on the relative position of the foreground and background objects in the image. In order to be able to extract information from structural regions, it is necessary to present an image that represents these structural regions in separate images.

Therefore, in this research, the model of work [9] is used as an image representation. This model is different in that it represents an image of a scanned document as a set of images, each of which contains one class of a uniform area – graphics, or photos, or text on a uniform background. This image model represents text areas as a structural texture with text symbols as non-derivative elements, and illustration areas as areas of constant intensity. Such a representation of the image of the scanned document allows to take into account the structural properties of homogeneous areas and choose a system of signs for their identification, which have high computational efficiency, which entails a reduction in the processing time of the image with sufficient quality segmentation.

The next step is dividing the image of the scanned document into an image containing illustrations and an image containing text areas and a background. To do this, use the method developed in [10] to select illustrations on an image of a scanned document using averaging filtering. According to this method, homogeneous areas of text and illustrations are distinguished by analyzing connected components. The use of analysis of connected components allows to distinguish the areas of illustrations from areas of text, since they are connected components that correspond to the characters of the text, differ from the connected components corresponding to the illustrations, in their form and periodicity. That is, the size of the connected components corresponding to the characters of the text acts as a sign for identifying the text. Using a hierarchical approach to segmentation allows to compute simple, computationally, features for text areas and segment the original image of the scanned document into 2 images: one of them contains illustrations on a uniform background, the other is text and background. The use of «simple» signs reduces the processing time of the image, and the use of averaging filtering when selecting areas of illustrations preserves a sufficiently high image segmentation quality.

According to the hierarchical approach (Fig. 1), the third level of the hierarchy presents images containing photos, graphics, text, and background, separately from each other.

First, the areas of illustrations are divided into homogeneous areas, which differ in their structure: photos and graphics. To do this, let’s consider the part of the hierarchical structure in which the image is located, containing areas of illustrations. To this end, a method proposed in [11] was proposed for identifying graphic and photo areas using statistical and geometric features. To reduce image processing time while identifying photo and graphics areas, the illustration areas are divided into blocks of fixed size. When block processing is usually the quality of segmentation is reduced, it is therefore necessary to use such signs of identifying homogeneous areas that have high computational efficiency, that is, provide sufficient quality segmentation with a short image processing time. Therefore, it is proposed to use the aspect ratio of objects and the estimate of the expectation of the height of the intensity drop at the borders of homogeneous areas as identification signs in [11]. As the first, a feature is chosen that characterizes an object representing graphics as an image that contains linear objects [12], represented...
by contours of different widths and lengths. The second feature allows to distinguish the graphic areas from the photo, given that the graphic areas are characterized by fewer shades of gray than the photos, which entails an increase in the height of the intensity differences between the gradations.

Next, the text areas on the images of scanned documents are separated from the background. For this purpose, the method of selection of text areas [13] is used, which allows to take into account the distances between text characters when processing image lines and the distance between text lines when processing images in columns. Processing in the vicinity of each pixel of the image reduces processing time and maintains a sufficiently high image quality.

3. Research results and discussion

To estimate the processing time of scanned documents images, using a hierarchical approach to image segmentation, images of scanned articles and journals of the MediaTeam Oulu document database [14] were used.

Experimental studies were conducted using a computer that has the following technical and system characteristics: Intel Core i5-3210 processor, 2.5 GHz CPU, 6 GB RAM, 64-bit Windows 7 operating system. 92 test images of scanned documents were selected that contained the main text, headlines, photos and graphics. Images of the used document base are 3200 × 2300 pixels in size and scanned with a resolution of 300 dpi, which gives a rather high quality of the scanned document. Examples of analyzed images are presented in Fig. 2.

The results of the experiment were compared with the results of [2, 3, 5], in which the studies were performed using a 2.4 GHz dual-core processor and a 64-bit Windows 7 operating system. The technical and system characteristics of this study and the analyzed works are comparable, therefore the results of these works can be added to the comparison.

The results of the processing time to use a hierarchical approach to segmentation and known approaches are given in Table 1.

The system and hardware resources of computers that were used for experiments in [2, 3, 5] and in this study had comparable characteristics. The results presented in Table 1 allow to conclude that the use of the proposed hierarchical approach to the segmentation of images of scanned documents has significant advantages in speed.

Further studies can be aimed at solving the segmentation problem in order to increase speed by introducing parallel processing of homogeneous areas at one level of the structure.

4. Conclusions

In this article it is proposed to use a hierarchical approach in the segmentation of scanned documents images. This approach allows homogeneous regions of an image to be represented using a tree structure in which the regions of the lower level strictly correlate with a specific region of the image of the upper level. According to this approach, the areas of illustrations and areas containing text and background are objects of the same level of structure. A field of photos, graphics, text and background presented at a different level. This allows to perform processing separately for each image area, as well as significantly reduce processing time at each level.

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![Fig. 2. Examples of scanned documents images of the MediaTeam Oulu database [14]](image)

| Cluster center-based classification method [2] | Fisher classifier method [2] descending approach | Method (3) descending approach | Method (5) ascending approach | Hierarchical approach |
|-----------------------------------------------|-------------------------------------------------|-------------------------------|-------------------------------|--------------------|
| 158 s                                         | 139 s                                           | 286 s                         | 155 s                         | 2.3 s              |

Table 1

Image processing time by the analyzed methods
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