Anhang C

Auswertung des Entzerrungsalgorithmus

Die Auswertung erfolgte anhand eines Vergleichs der Erkennungsraten. Einmal wurde im Vorfeld der Texterkennung eine Entzerrung mit Hilfe des vorgestellten Algorithmus durchgeführt und einmal wurde die Entzerrung vom systemeigenen Entzerrungsmodul von OmniPage 16 übernommen. Das Ergebnis der Auswertung wird wie folgt visualisiert:

- 1. Entzerrte und binarisierte Version eines Dokuments
- 2. Das Ergebnis der Zeichenerkennung nach der Entzerrung mit dem vorgestellten Algorithmus
- 3. Das Ergebnis der Zeichenerkennung ohne Beteiligung vom Algorithmus

	Anzahl der Wörter	Fehlerrate mit Algorith- mus	Fehlerrate ohne Algo- rithmus
Beispiel A	657	92,5%	91,7%
Beispiel B	640	95,4%	93,8%
Beispiel C	807	93%	91,6%
Beispiel D	91	87,9%	76,9%
Beispiel E	847	94,2%	91%
Beispiel F	799	91,6%	87,3%
Beispiel G	614	97,7%	96%
Beispiel H	489	94,5%	91,4%

/Beispiel A

Beispiel I	155	85,2%	87,7%
Beispiel J	708	94,8%	95%
Beispiel K	462	88,7%	86,6%
Beispiel L	277	85,2%	85,6%

Extraction of illusory linear clues in perspectively skewed documents

Maurizio Pilu Hewlett-Packard Laboratori Bristol, BS34 8QZ, UK maurizio_pilu @ hp.com

Abstract

This work deals with the recovery of illusory linear clues from perspectively skewed documents with the purpose of using them for rectification. The computational approach proposed implements the perceptual organization principles implicitly used in textual layouts. The numerous examples provided show that the method is rubust and viewpoint and scale invariant.

1. Introduction

As sensor resolution increases and prices drop, cameras will one day be used to capture documents in lieu of flatbed scanners. One of the main disadvantages when capturing a document with a camera is that the non-contact image capture process causes geometric distortions dependent upon the camera orientation, in particular perspective skew, as typified in Figure 1-left.

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This work addresses a fundamental problem that need to be faced when trying to passively deskew a captured document, namely the detection of linear clues that can be used as geometric primitives to determine the document plane orientation w.r.t. the camera and the rectifying homogra-

phy.

Figure 1-left shows several kinds of linear clues that may arise in practice. Clue A is a vertical illusory [2] clue. It does not correspond to an actual linear feature but rather to a set of organized features arranged linearly. Clue B is a vertical hard line which is the projection of the actual document edge. Clues C are horizontal illusory lines, which have been inferred from the arrangement of characters into text lines. Similarly to clue B, clue D is a horizontal hard line. Clue E is a quadrilateral that can be either illusory or corresponding to an actual rectangular outline in the document (e.g. a figure box or the four document boundaries). Hard edges of the type B and D can be detected rather trivially in many ways using edge detectors (e.g. the Hough transform) and will not be addressed as such in this paper. Illusory edges such as C and A are rather difficult to find reliably in practice and most of the literature on document analysis

has been only focusing on recovering groups of parallel text lines to compensate for rotation for OCR and other scanning annications.

In this paper we will be dealing with the problem of finding illusory clues of the type A and C without assumptions on the type of document, fonts or camera rotation and orientation other than the presence of some organized text. Text had been designed long before perception studies

Text had been designed long before perception studies but with the unspoken principles of perceptual saliency (see e.g. [2]) in mind. Give any organised text, even foreign and unintelligible to us, and words, lines and paragraph structures pop out preatientively. The approach presented in this paper is strongly based on a computational implementation of these perceptual organization principles and will be shown to be robust, fast and general

2. Related works

The subject of correcting perspective skew in documents has been largely neglected in the literature. Even recent works explicitly addressing camera-based document imaging such as [14] treat only rotation-induced skew.

The geometry of the rectification is well known [6] but the problem of passively and robustly detecting the geometric features needed is still open.

A substantial body of research has been dedicated to text and page segmentation in document images, but any distortion considered is a gain only rolation-induced. The main bottom-up methods used include many variations on projection profiles approaches, Hough-inspired techniques [12] and nearest-neighbour clustering [91[31]. Top-down methods seek to extract the high-level structure of the images, such as by using Manhattan layout analysis of the (white) background [13]. Methods that analyse connected components as we do are fairly common in document analysis. Besides the aforementioned [9][13] and others, an interesting approach that employs perceptual organization principles is [11], although assuming of parallel-lines. All the methods above assume that the text lines are still parallel in the image and could not work with perspective skew. The work

Beispiel A

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Flattening Curved Documents in Images

Jian Liang, Daniel DeMenthon. David Doermann Language And Media Processing Laboratory University of Maryland College Park. MD. 20770 {lj.daniel.doermann} qcfar.umd.edu

Abstract

Compared to scanned images, document pictures captured by camera can suffer from distortions due to perspective and page warping. It is necessary to restore a frontal planar view of the page before other OCR techniques can be applied. In this pager we describe a novel approach for flattening a curved document in a single picture captured by an uncalibrated camera. To our knowledge this is the first reported method able to process general curved documents in images surface by a developable surface, and exploit the properties (parallelism and equal line spacing) of the printed textual content on the page to recover the surface shape. Experiments show that the output images are much more OCR friendly than the original ones. While our method is designed to work with any general developable surfaces, it can be adapted for typical special cases including planar pages, scans of thick books, and opened books.

1. Introduction

Digital cameras have proliferated rapidly in recent years due to their small size, ease of use, fast response, rich set of features, and dropping price. For the OCR community, they present an attractive alternative to scanners as imaging devices for capturing documents because of their flexibility. However, compared to digital scans, camera captured document images often suffer from many degradations both from intrinsic limits of the devices and because of the unconstrained external environment. Among many new challenges, one of the most important is the distortion due to perspective and curved pages. Current OCR techniques are designed to work with scans of flat 2D documents, and cannot handle distortions involving 3D factors.

One way of dealing with these 3D factors is to use special equipments such as structured light to measure the 3D range data of the document, and recover the 2D plane of the page '1, 12]. The requirement for costly equipment, however, makes these approaches unattrac-

The problem of recovering planar surface orientations from images has been addressed by many re-searchers inside the general framework of shape estimation [5, 7, 10], and applied to the removal of perspective in images of flat documents [3, 4, 11]. However, page warping adds a non-linear, non-parametric process on top of this, making it much more difficult to recover the 3D shape. As a way out, people add in more domain knowledge and constraints. For example, when scanning thick books, the portion near the book spine forms a cylinder shape [8], and results in curved text lines in the image. Zhang and Tan [16] estimate the cylinder shape from the varying shade in the image, assuming that flatbed scanners have a fixed light projection direction. In terms of camera captured document images, Cao et al. [2] use a parametrical approach to estimate the cylinder shape of an opened book. Their method relies on text lines formed by bottom-up clustering of connected components. Apart from the cylinder shape assumption, they also have a restriction on the pose that requires the image plane to be parallel to the generatrix of the page cylinder. Gumerov et al. [6] present a method for shape estimation from single views of de-velopable surfaces. They do not require cylinder shapes and special poses. However, they require correspondences between closed contours in the image and in the unrolled page. They propose to use the rectilinear page boundaries or margins in document images as contours. This may not be applicable when part of the page is occluded.

Another way out is to bypass the shape estimation step, and come up with an approximate flat view of the page, with what we call shape-free methods. For scans of thick bound volumes, Zhang and Tan [15] have an-

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Cao et al. 121 use a parametrica, 1 approach to estimate the cylinder shape of an opened book. Their method relies on text lines formed by bottom-up clustering of connected components. Apart from the cylinder shape assumption, they also have a restriction on the pose that requires the image plane to be parallel to the queratrix of the page cylinder. Gumerov et al. 161 present a method for shape estimation from single views of developable surfaces. They do not require cylinder shapes and special poses. However, they require correspondences between closed contours in the image and in the unrolled page. They propose to use the rectilinear page boundaries or margins in document images as contours. This may not be applicable when part of the page cylinders, and approximate flat view of the page, with what we call shape-free methods. For sau-is of thick bound volumes, Zhang and Tan 1151 have an-
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other method for straightening curved text lines. They find text line curves by clustering connected components, and move the components to restore straight horizontal baselines. The shape is all unknown but image can be OCRed. Under the same cylinder shape and parallel view assumptions as Got et al. have. Tool et al. [14] fattent images of opened books by a billinear morphing operation which maps the curved page boundaries to a rectangle. Their method is also shape-free. Although shape-free methods are simple, or an only deal with small distortions and can not be applied when shape and pose are arbitrary.

Our goal is to restore a fortial planar image of a warped document page from a surgle picture captured by an uncubitated digital curren. Our method is based on two key observations: I) a curved document page can be modeled by a developable surface, and 2) printed textual centent on the page forms starture from frost strong for the strain of the project integer with the project integer and the models of the visual current of the forms the textual channet strains are projected image, which represent the local orientations of projected image, which represent the local orientations of projected integers and the could be strained projected on the railings and texture flow receives and the capture of the strained projection of the surface can be mapped isometric projected image, which represent the local orientations of projected image, which represent the local orientations of projected integers and the capture of the strained projection of the surface such as projected image, projected integers and the capture of the strained projected integers and the capture of the strain of the capture of the strained projected integers and the capture of the strained projected integers and the capture of the strain of the ca

developable document pages.

The remainder of this paper is organized into five sertions. Section 2 introduces developable surfaces and describes the texture flow fields generated by printed act on document pages. Section 3 focuses on texture flow field cartaction. We describe the details of surface estimation in Section 4, and discuss the experimental

Figure 1. Strip approximation of a developable surface results in Section 5. Section 6 concludes the paper

2. Problem Modeling

The shape of a smoothly rolled document page can be modeled by a developable surface. A developable surface can be maped sometically onto a Euclidean plane, or in plain English, can be unrolled onto a plane without tearing or stretching. This process is called development of the surface such as curve leapth or angle formed by curves.

Rulings play a very important role in defining developable surfaces. Through any point on the surface there is one and only one ruling, except for the degenerated case of a plane. Any two rulings do not intersect except for conic vertices. All points along a ruling share a onemon tangent plane. It is well known in elementary differential geometry that gives numbered sidentification differential geometry that gives a plane, a cylinder, a cone, the collection of the tangents of a curve in space, or a composition of these types. On a cylindrical surface, all rulings are parallel, on a cone surface, all rulings intersect at the conic vertex for the tangent surface, and rulings are the tangent lines of the underlying space curve; only in the planar case are rulings out uniquely defined.

The fact that all points along a ruling of a developable surface share a common tangent plane to the surface leads to the result that the surface is the envelope of a one-parameter family of planes, which are its tangent planes. Therefore a developable surface can be piecewise approximated by planar attent as the finally of tangent planes (Fig. 1). Although this sonly a first order approximation it is sufficient for our application. The group of planar strips can be fully described by a set of reference points.

Suppose that for every point on a developable surface was the forest that a surface was that the tangent series as the fore every point on a developable surface was the fore every point on a developable surface was the fore every point on a developable surface was the fore every point on a developable surface was the fore every point on a developable surface was the fore ev

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Although shape free methods are simpler, they can only deal with small distortions and can not be applied when shape and pose are arbitrary.

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Printed textual content provides the most prominent anel stable visual featurm in document images; 3. 11. 2, 151. In real applicationa, other visual cues are not as reliable. For exam, ple. shade may be biased by multiple light sources, contours and edges may be occluded. In term of the way of using printed textual content in images, our work differ, from 15, 21 in that we do not rely on connected component analysis which may have difficulty with figures or tables. The mixture of text and non-text element, will also make traditional shape-from-texture techniques difficult to apoly. While our texture flow based method can still work. Overall, compared to others work, our method does not require a flat page, does not require 30 range data, does not require ca
    Rulings play a very important role in defining deformed by curves.

velopable surfaces. Through any point on the surface there is one 3.nd only one ruling, except for the degenerated case of a plane. Any two rulings do not intersect except for conic vertices. All points along a ruling share a common tangent plane. It is well known in elementary differential geometry that given sufficient differentiability a developable surface is either a plane. a cylinder, a cone, the collection of the tangents of a curve in space, or a composition of these types. On a cylindrical surface, all ruling, are parallel; on a conic surface. All rulings intersect at the conic vertex; for the tangent surf CMC, the rulings are the tangent lines of the underlying space curve; only in the planar case are ruling,s not uniquely defined.

The fact that all point, along a ruling of a developable surface leads to the result that the surface is the env, lope of a one-parameter family of planes, which are its tangent, planes. Therefore a developable surface can be piecewise approximated by planar strips that belong to the family of tangent planes frip that belong to the family of tangent planes from the surface is the env, application. The group of planar strips can be fully described by a set of reference points kg} along a curve on the surface, and the surface normals 1,1%:3 at these
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are parallel with respect to the underlying surface
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Praventivsport Herzsport Seniarensport
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of ACIVS 2002 (Advanced Concepts for Intelligent Vision Systems), Ghent, Belgium, September 9-11, 200

ON THE RECOVERY OF ORIENTED DOCUMENTS FROM SINGLE IMAGES

Paul Clark and Majid Mirmehdi

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ABSTRACT

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A method is presented for the fronto-parallel recovery of text documents in images of real scenes. Initially an extension of the standard 2D projection profile, commonly used in document recognition, is introduced to locate the horizontal vanishing point of the text plane. This allows us to signent the lines of text, which are then analysed to reveal the style of justification of the paragraphs. The change in line spacings exhibited due to perspective is then used to recover the vertical vanishing point of the document. We do not assume any knowledge of the focal length of the camera. Finally, a fronto-parallel view is recovered, suitable for CGR or other high-level recognition. We provide results demonstrating the algorithm's performance on documents over a wide range of orientations.

1. INTRODUCTION

Optical character recognition (OCR) is a long-standing area of computer vision which in general deals with the problem of recognising text in skew-compensated fronto-parallel images. In preparation to apply OCR to text from images of real scenes, a fronto-parallel view of a segmented region of text must be produced. This is the issue considered in this paper. The extraction of oriented documents from camera images is a new challenge in document processing, made possible by high resolution digital cameras, as well as recent developments and demands in the multimedia environment. There has been little research into the recognition of text in real scenes in which the text is oriented relative to the camera. Processing and compensating for vach perspective skew has applications in replacing the document scanner with a point-and-click camera to facilitate non-contact text capture, assisting the disabled and/or visually imparate, wearable computing tasks requiring knowledge of local text, and general automated tasks requiring the ability to read where it is not possible to use a scanner.

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Previous work in estimating the orientation of planar surfaces in still images varies in the assumptions made to achieve this. Ribeiro and Hancock [1] and Criminisi and Zisserman [2] both presented methods which used the distortion of repetitive planar texture to estimate the vanishing points of the plane. Affine transformations in power spectra were found along straight lines in [1], and correlation measures were

used in [2] to determine first the orientation of the vanishing line and then its position. Although text has repetitive elements (characters and lines) these elements do not match each other exactly, and sometimes may cover only a small area of the image. Rother [3] attempted to find orthogonal lines in architectural environments, which were assessed relative to the camera geometry. Murno and Foresti [4] used a 3D Hough transform to estimate the orientation of planar shapes with known rectilinear features. Gool et al. [5] and Yip [6] both found the skewed symmetry of 2D shapes which have an axis of symmetry in the plane, allowing for affine recovery. We require recovery from perspective transformation, and as with these latter works we will use a prior information about the 2D shape we are observing. Other than our recent work in [7], the only other work known to the authors on perspective recovery of text is [8]. The author seeks visual clues in the image which correspond to horizontal and vertical relatives on the document is enamed to horizontal and vertical relatives on the document of the extensive stimulated when only one vertical clue is present. Examples of this situation are when the document is single-column and when paragraphs are not fully justified.

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Knowledge of the principal vanishing points of the plane on which text lies is sufficient to recover a fronto-parallel view. We observe that in a paragraph which is oriented relative to the camera, the lines of text all point towards the horizontal vanishing point of the text plane in the image. Also, paragraphs often exhibit some form of justification, either with straight margins on the left and/or right, or if the text is centred, a central vertical lines point towards the vertical vanishing point of the text plane. We have therefore concentrated our work on the recovery of paragraphs with three lines of text or more, with the reasonable assumption that at least some justification exists (left, right, centred or full).

To avoid the problems associated with bottom-up grouping of elements into a paragraph model, in this work we ensure the use of all of the global information about the paragraph at one time. The principle of 2D projection profiles are extended to the problem of locating the horizontal vanishing point by maximising the separation of the lines in the paragraph. The segmented lines of text are then analysed to reveal the style of justification or alignment of the paragraph. De-

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	VP error	Angulai error
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Table 2: Average error for the various methods over 10° 1 80° in yaw and pitch.

Figure 9: Fronto-parallel recovery of example documents in

performance is poor due to the paragraph's jagged edge, as can be seen in Figure 8(b). Finally, Figure 8(c) shows the accuracy when the line spacings are employed on left-justified paragraphs. This method provides good results comparable to the first for all of the simulated images except those documents oriented beyond 80° in pitch, where the algorithm begins to fail. As with the horizontal vanishing point in Sec-tion 3, this may be explained by the orientation of the docu-ment becoming nearly perpendicular to the image plane. As such an extreme tilt, even if the lines of text are separated correctly, their proximity in the image means there is little accuracy in position and spacing for the curve fitting. In real world images, documents at such extreme angles cannot practically be read or used by OCR once recovered, hence this failure does not concern us. The advantage of the line spacings method is that it provides consistent results for para-

spacings method is that it provides consistent results for paragraphs which are not fully justified.

The results for these experiments, and the location of the horizontal vanishing point in Section 3, are shown numerically in Table 2. The vanishing point (VP) error is calculated as the relative distance of the vanishing point from its ground ruth, as described in Section 3. The angular error is denved from the final determined orientation of the horizontal and vertical vectors of the text plane. It can be seen that he accuracy of location of the vertical vanishing point in reasonable for both the margin intersection and the line spacings method. As the last row of Table 2 shows, intersecting margins is not suitable for documents with jagged edges.

Having found the vanishing points of the plane, we may project two lines from each to describe the left and right margins and the top and bottom limits of the paragraph. These lines are intersected to form a quadrilateral enclosing the text, as shown in Figure 6. This quadrilateral sit them used to recover a fronto-parallel viewpoint of the paragraph of text.

The recovered page for the running example may be seen in

a fronto-parallel viewpoint of the paragraph of text. The recovered page for the running example may be seen in Figure 9, alongside the second example introduced earlier Further examples in Figure 10 show the recovery of different styles of paragraphs with left justified and centrally aligned text. Figure 10(s) shows the recovery of a segmented re-gion of a book over. Despite text of different sizes, and other image noise such as the specularity, the document is

recovered robustly. Figure 10(b) shows a centrally justified paragraph which has been recovered at high resolution and is easily readable. In Figure 10(c) a left justified document was correctly identified and recovered, despite occlusion of part of the paragraph. When we applied commercial OCR software to the image in Figure 9(b). 87% of the characters and 94% of the words were recognised correctly.

6. DISCUSSION

We have presented a novel approach to the fronto-parallel recovery of a wide range of documents under perspective transformation in a single image, without knowledge of the focal length of the camera. Projection profiles from hypothesised vanishing points are used to robustly recover the horizontal vanishing point of the text plane, and to segment the points a summing points are used to robustly recover the horizontal vanishing point of the text plane, and to segment the paragraph into its constituent lines. Line fitting on the margins and central line of the document is then applied to deduce the style of justification of the paragraphs. To estimate the vertical vanishing point, for fully justified paragraphs the margin lines are intersected. For other styles of documents, the observed difference in the spacings of the lines of text are used to retrieve the tilt of the text plane, and hence the vertical vanishing point. Using the two principal vanishing points we find the orientation of the text plane and recover a fronto-parallel view. The algorithm performs well for a wide range of paragraphs, provided each paragraph has at least three lines, or is fully justified. An optimisation algorithm for the search for the horizontal vanishing point was presented. In total the process takes around 10 seconds to recover a document, demonstrating its potential and applicability to realtime systems, as well as its suitability for normal seanning tasks.

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Usage of continuous skeletal image representation for document images dewarping.

Anton Masalovitch, Leonid Mestetskiy Moscow State University, Moscow, Russia anton m@abh :com l.mest@ru.net

Abstract

In this paper application of continuous skeletal image representation to documents' image de-warping is described. A novel technique is presented that allows to approximate deformation of interlinear spaces of image based on elements of image's skeleton that lie between the text lines. A method for approximation of whole image deformation as combination of single interlinear spaces deformations is proposed and representation of it in the form of 2-dimensional cubic Bezier patch is suggested. Experimental results for batch of deformed document images are given that compare recognition quality of images are given that compare recognition quality of images the form of the de-warping process. These results prove efficiency of the proposed algorithm.

1. Introduction

All the modern OCR systems assume that text lines in a document are straight and horizontal while in real images they are not. Image can be deformed before recognition in various ways. For example, if a thick book is scanned, text lines on the scan may be wrapped near the spine of book. If a digital camer is used to retrieve the image instead of a scanner, the text lines was best till wrapped because of low-quality opites of digital camer as. One important example of such deformation is the rounding of an image on borders as result of barrel distortion. Moreover, several types of deformation could be applied to the same image, making it impossible to build a precise model of image deformation. This is how the task of image de-owarping appears.

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The approach proposed in this paper is based on the construction of outer skeletons of text images. The main idea of the proposed algorithm is based on the fact that it is easy to mark up long continuous branches that define interinear spaces of the document in outer skeletons. We approximate such branches by cubic Bezier curves to find a specific deformation model of

each interlinear space of the document. On the basis of each interlinear space of the document. On the basts of a set of such interlinear spaces approximations, the whole approximation of the document is built in the form of a 2-dimensional cubic Bearer patch. After all this work is completed, we can de-warp an image using obtained approximation of image deformation. This work is an extension of the article [19]. In this paper new method of automatic search for interlinear branches of skeleton is described. Also iteration method of image deformation approximation adjustment is given.

To test our algorithm we compare recognition results for a batch of images before and after the dewarping process.

warping process.

2. Existing solutions

Algorithm of automatic image de-warping is needed nowadays for automatic OCR systems. Plenty of algorithms for image deformation approximation appeared in the last several years (see for example [7-11]). Unfortunately, most of these algorithms have some disadvantages that make them unusable for commercial OCR systems.

Existing solutions can be divided to three approaches:

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First approach is to single out text lines by combining close black objects and then approximating each line shape using some characteristic points of line's black objects. For example, one can approximate text lines' shape by using middle points of black objects bounding rectangles. Man disadvantage of this approach is that it is hard to define such characteristic points of black objects that can give a stable approximation of line shape.

Second approach is to build a model of possible deformation of an image and then try to apply this model for a specific image. Main disadvantage of this method is that it is almost impossible to build a complete model of image deformation. And if such a model describes only one type of deformation, one

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dimensional cubic Sezier patch is suggested.
Experimental results for batch of deformed document
images are given that componer recognition quality of
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images before and after de-warping process. These
results prove efficiency of the proposed algorithm.
Introduction
     I. Introduction
All the modern OCR systems assume that text lines
All the modern OCR systems assume that text lines in a document are straight and horizontal while in real imaces, they are not. Imace can be deformed before recognition in various ways. For example, if a thick book is scanned, text lines on the scan may be wrapped near the spine of book. If a digital camera is used to retrieve the image instead of a scanner, the text lines rnay be still wrapped because of low-quality optics of digital cameras. One important example of such deformation is the rounding of an image on borders as result of bare! distortion. Nigreover, several types of deformation could be applied to the same image, making it impossible to build a precise model of tillage deformation This is how the task of image de-warping appears.
   The main idea of the proposed algorithm IN based on the fact that it is easy to mark up long continuous branches that define interlinear spaces of the document in outer skeletons. We approximate such branches by cubic esteroid experies curves to find a specific deformation model of
e_ezier curves to find a specific deformation model of 45
a set of such interlinear spaces' approximations, the whole approximation of the document is built in the form of a 2-dimensional cubic Bezier patch. After all this work is completed, we can de-warp an imac. Ae using obtained approximation of image deformation. This work is an extension of the article [II In this paper new method of automatic search for interlinear branches of skeleton is described. Also iteration method of image deformation approximation adjustment is given.
To test our algorithm we compare recognition results for a batch of images before and after the dewarping process.
2. Existing solutions
Algorithm of automatic image de-warping is needed nowadays for automatic OCR systems. Plenty of algorithms for image deformation approximation appeared in the last several years (see for example [7-ID. Unfortunately, most of these algorithms have some disad'antages that make them unusable for commercial OCR systems.

Existing solutions can he divided to three approaches:

First approach is to single out text lines by
 Existing solutions can he divided to three approaches:

First approach is to single out text lines by combining close black objects and then approximating each line shape using some characteristic points of line's black objects. For example, one can approximate text lines' shape by using middle points of black objects' bounding rectangles. Main disadvantage of this approach is that It is hard to define such characteristic points of black objects that can give a stable approximation of line shape.

Second approximation of line shape.

Second approximation of an Image and then try to apply this model for a specific image. Main disadvantage of this method is that it is almost impossible to build a complete model of image deformation. And if such a model describes only one type of deformation. one
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Perspective Correction Methods for Camera-Based Document Analysis

L. Jagannathan and C. V. Jawahar

Center for Visual Information Technology International Institute of Information Technology Gachibowli, Hyderabad, India

In this paper, we describe a spectrum of algorithms for rectification of document images for camera-based analysis and recognition. Clues like document boundaries, page layout information, organisation of text and graphics components, apriori knowledge of the script or selected symposis to the selected symposis to the properties of the comment image analysis algorithm, Appropriate results from projective geometry of planar surfaces are exploited in these situations.

1. Introduction

Document images are omnipresent. Textual content in the form of books, newspapers and articles have been traditionally digitated using a t-bed scanners and read with the help of OCRs. These reading systems may not be appropriate in situations where mobile, portable or non-contact reading systems are needed. Cameras, which can scan text without contact even on non-planar surfaces, is an emerging alternative to the conventional seamers. In general, cameras are small in size, lightweight and easy to use. Although many of the present day scanners outperform the popular cameras in resolution, the cameras remain attractive alternative especially in situations described above and for many of the present day scanners of the remains expecially in situations described above and for anorenticle applications. Advances in sensor technology is expected to take the camera-based systems more favorable.

Camera-based imaging process introduce many new challenges to the document understanding from the control of t

Figure 1. Original Image of a license plate (a) and its perspective corrected version (b). Two selected characters ('A' and 'E') are shown before (c) and after (d) rectification.

c videos capture an image similar to Figure I(a), while Figure I(b) is better processed by a machine. The transformation between the two images is achieved by removing the perspective distortion. The perspective distortion of a planar surface can be understood as a projective transformation is a generalised linear transformation (Homography) dened in a homogeneous coordinate system. Different clues in the document image itself could be used for the purpose of rect cation. Boundaries of documents, page layout and textual structure provide important clues to rectify the perspective distortion. Where gross structure is absent in the document, word level or character level information could be used in recovering the fronto-parallel view from an arbitrary view. In this paper we explore various recti cation techniques that are useful for projective correction of document images.

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Perspective Correction Methods for Camera-Based Document _Analysis L. _Bacarmathan and C. _V. _Jawahar Center for Yisual Information Technology International Institute of Information International Institute International International
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Perspective Correction Methods for Camera-Based Document Analysis
L. Jagannathan and C. V Jawahar
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Camera-based imaging process introduce inany new
challenges to the document widerstanding process [1]. Im-
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rithms for understanding the images with these distortion
would become much more complex due to the addi-
tional parameters to be taken care while designing the eat-
fees:distortions for intelligent processing of document In-
ages. A license plate reading system [7] analysing the eat-
Figure I.
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7fach Punkte auf Ihren Einkauf bei Alnatura *

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Beispiel I

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model of the discrete binary image In the same Euclidean plane \mathbb{R}^2 , we define the polygonal figure μ as the set of the points formed by association of a finite number of non-overlapping bounded closed domains. This figure is then a model of the continuous binary image. There is a problem consists in the construction of the figure μ that adequately describes properties of the discrete image B. In mathematical terms this problem is posed as an approximation of a discrete object with a continuous object. Natural criteria of good approximations should satisfy the following natural criteria:

1) $B\subset \mu$, $W\subset R^2\setminus \mu$, where means closure of a set;

2) Let $x, y \in I$ be a pair of adjacent nodes of the lattice and s_{xy} be a segment connecting these nodes.

Then if $x, y \in \mu$, then $s_{xy} \in \mu$, and if $x, y \notin \mu$ then $s_{xy} \cap \mu = \emptyset$.

The first condition means that the figure covers all black points of a discrete image and all white points lie either outside of or on the boundary of the figure. The second condition as no reduced to the condition that the boundary of μ lies in the interface between white and black boundary points of the discrete image.

Let M be the set of all figures satisfying conditions 1 and 2. Any of them can be considered a continuous model of a binary image with acceptable accuracy. As we are going to build a skeleton of this figure, the most convenient representation for us is the figure with a piecewise Innear boundary, since for such figures that piecewise Innear boundary, since for such figures that piecewise Innear boundary, since for such figures from M a polygonal figure (PF) with minimal perimeter (see fig. 2). First, such PF exists and it is unique. Second, the number of its vertices is close to minimal among all PF satisfying conditions 1 and 2.

Figure 2. Representation of raster object with polygonal figure with minimal perimeter algorithm for solving this problem which requires a single pass over a raster image, has been described in [4].

6. Continuous skeletal representation of an image

The choice of the polygonal figure as a continuous model of the binary image reduces the problem of construction of a skeleton of the image to the well-known medial asix transform [3]. Contrary to discrete images for which the skeleton is determined ambiguously, the concept of a skeleton of a continuous figure has a strict mathematical formulation. The skeleton of a figure is the locus of points of centers of maximal empty circles. An empty circle does not maximal empty circle is a circle which is not contained in any other empty circle, and which is not contained in any other empty circle, and which is not continued to another. Note that empty, circles can be thus either internal or external for the domains comprising the figure. Accordingly, their centers form internal and external skeletons of the figure (see fig. 3).

Figure 3. Empty circles for polygonal figure and skeleton of polygonal figure.

This definition applies to any type of shape, not just a polygon. However there exist effective algorithms for construction of polygonal figures [4,6]. The algorithm used [2,3] is based on a generalization of Delauney triangulation for a system of sites of two types (points and segments) that comprise a PF boundary. It builds a skeleton in time O(n log n) where n is the number of PF vertues.

n is the number of PF vertuces.

Skeleton of polygonal figure can represented as a planar graph, where nodes are points on a plane and bones are straight lines that connect the nodes. In such representation of a skeleton all nodes have no less than three nearest points on the border of the area and all bones lie between two linear fragments of the area border. Later in this article we will use only graph

representation of a skeleton.

Let us also define a knot in skeleton as a node with more then two connected bones and final node as a node with only one connected node. And let us define a branch of skeleton as a consistent set of bones that has final node or knot node on each end and does not have knots in the middle of the branch. Later in this article we will operate only with branches of the skeleton and not with single bones.

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Let M be the set of all figures satisfying conditions 1 and 2. Any of them can be considered a continuous model of a binary image with acceptable accuracy. As we are going to build a skeleton of this figure, the most convenient representation for us is the figure with a piecewise linear boundary, since for such figures there are effective algorithms for construction of a skeleton. In this situation it is natural to choose from M a polygonal figure (PF) with minimal perimeter (see fig. 21, First, such PF exists and it is unique Second. the number of its vertices is close to minimal among all PF satisfying conditions 1 and 2.

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Biohotel und das historischen
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holsamen Stunden immitten der
Brandenburger Natur ein. Auch
Fur Hochzeiten doer Familienfei-
em setzt das Landout A. Borsig
em setzt das Landout A. Borsig
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Erentwes sucht, ist beim Landout
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Fahrtminuten von Berlin-Mitte
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rung findet jeden ersten Sonntag
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Michael Stober mehr über die-
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Fahrtminuten von Berlin-Mitte
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26.50 Euro gibt es dann neben
dem Rundgang auch noch ein
Deri-Gänge-Nenü. Und Eur BUGA
2013 oräsentiert das Landaut
als Referenstandort rechtzeitig
weitere spannende Angebote
rund um Nachhaltickeit und
Natur. Weitere Infos unter www.
Landaut-aborsio de
Gewinden
Übermachtung
   Sie eine

Ubernachtung
in einer Suite

Grün zweil

Schlossstraße live und der

neue BUGA-Referenzstandurt

neue BUGA-Referenzstandurt

Buganne Bernachtung (Nach Re-

servierung) in einer der urab-

zugigen Suiten im Biohotel

des Landqur A. Borsig fur zwei

Personen inkl. Frünstück und

Drei-Gange-Nehü im Restau-

rant Seetsprassenu Sinsende-

Rechtsweg ist ausgeschlos-

sen. Schreiben Sie an:

zimmermannabendblatt-

berlin.de oder senden Sie

eine frankierte Postkarte an

Schlossstraße live, Postfach

300625, 10215 Berlin.

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Ausflugsziel für die ganze Familie: intakte Natur mit Wald, Wasserflachen sowie Parklandschaft.
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Aufnahmephase

Einfachheit mit einer ganzen Reihe von Schwachstellen verbunden:

- die Notwendigkeit einer frühzeitigen Binarisierung des Bildes
- Empfindlichkeit gegenüber der Zeilenorientierung und -krümmung
- Empfindlichkeit gegenüber der Schriftgröße

Kantenbasierte Methoden stellen eine Möglichkeit dar, die Binarisierungsproblematik zu umgehen. Neben den klassischen Kantenextraktionsoperatoren (s. Abschnitt 2.3) [64][65] werden Methoden der Grauwert-Morphologie [57] [58] für eine Transformation in den Kantenraum eingesetzt, in dem bestimmte textspezifische Klassifizierungsmerkmale einfacher extrahiert werden können. Ein weiterer Vorteil der Transformation ist die dabei stattfindende Hochpass-Filterung der Aufnahme, wodurch die negativen Effekte einer inhomogenen Beleuchtung gemildert werden.

Auch für die Orientierungsproblematik wurden bereits zahlreiche Lösungsansätze vorgeschlagen. In [62] wird eine Weiterentwicklung des RLS-Algorithmus vorgestellt, wobei statt eines achsensymmetrischen strukturierenden Elements eine Familie von unterschiedlich ausgerichteten Filtern für die Schließen-Operation verwendet werden, um den Filter zu bestimmen, der mit der Zeilenorientierung im Dokument korrespondiert. Eine ähnliche Überlegung steht hinter den *Projektionsprofilen* – einer häufig eingesetzten Methode [66][67] zur Feststellung der Textflussrichtung durch die Akkumulierung der Pixelwerte entlang einer Kurve. Mit Hilfe der auf diese Weise produzierten Profilhistogramme lässt sich u.U. nicht nur die Zeilenorientierung, sondern auch die Schriftgröße eines Textblocks grob abschätzen. Anhand der globalen Musteränderungen in den Profilen kann man darüber hinaus die Grenzen eines Textblocks (engl. recursive XY-Cuts [68]) ablesen oder Aussagen über den Inhalt [69] machen. Zu den großen Schwächen der Projektionsprofile zählt ihre Anfälligkeit (s. Abb. 5.1.2) gegenüber Dokumentverzerrungen [66].

Die Skalierungsproblematik stellt eine große Herausforderung für die Textlokalisierung dar. Eine zuverlässige Merkmalsextraktion ist auf die Kenntnis der erwarteten Schriftgröße angewiesen, während man für die Schätzung der Schriftgröße aussagekräftige textspezifische Merkmale benötigt. Viele der schnellen Methoden [57][58][61] werden daher durch die Wahl geeigneter Parameter auf einen bestimmten anwendungsabhängigen Schriftgrößenbereich zugeschnitten, wohin-

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• Empfindlichkeit gegenilber der Zeilenorientierung und -krummune
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   mildert werden.
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Auch filr die Orientierungsproblematik wurden bereits zahlreiche LOsung.sansatze vorgeschlagen. In [62] wird eine Weiterentwicklung des RLS-Algorithmus vorgestellt, wobei statt eines achsensymmetrischen strukturierenden Elements eine Familie von unterschiedlich ausgerichteten Filtern ftir die Schließen-Operation 'erwendet werden, um den Filter zu bestimmen, der mit der Zeilenorientierung im Dokument korrespondiert. Eine ahnliche Oberlegung steht hinter den Prqieluionsprofilen – einer häufig eingesetzten Methode [661[67] zur Feststellung der Textflussrichtung durch die Akkumulierung der Pixelwerte entlang einer Kurve. Mit Hilfe der auf diese Weise produzierten Profilhistogramme lasst sich u.U. nicht nur die Zeilenorientierung, sondern auch die Schriftgroße eines Textblo'cr grob abschätzen. Anhand der globalen Musteränderungen in den Profilen kann man darilber hinaus die Grenzen eines Textblocks (engl. recursive XI-Cuts MI) ablesen oder Aussagen uber den Inhalt [69] machen. Zu den großen Schwachen der Projektionsprofile zahlt ihre Anfalligkeit (s. Abb. 5.1.2) gegentiber Dokumentverzerrungen [66].
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    mentverzerrungen [66].
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Die Skalierungsproblematik stellt eine große Herausforderung für die Textlokalisierung dar. Eine zuverlassige Merkmalsextraktion ist auf die Kenntnis der erwar teten Schriftgroße angewiesen, wahrend man für die Schatzung der Schriftgroße aussagekräftige textspezifische Merkmale benotigt. Viele der schnellen [57] [5811591161] werden daher durch die Wahl geeigneter Parameter auf einen bestimmten anwendungsabhangigen Schriftgroßenbereich zugeschnitten.
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