

# Graphics Recognition A Historical Perspective and Recent Advances Rangachar Kasturi

# Computer Science and Engineering University of South Florida Tampa, Florida, USA

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#### IAPR/ICDAR Award

Sargur Srihari, Nominator

Lawrence O'Gorman, Endorser Gabriella Sanniti di Baja, Endorser Karl Tombre, Endorser



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Venu Govindaraju

# ICDAR 2017 Organizing Committee Koichi Kise and Team



#### IAPR/ICDAR Award

I would like to Dedicate this award to

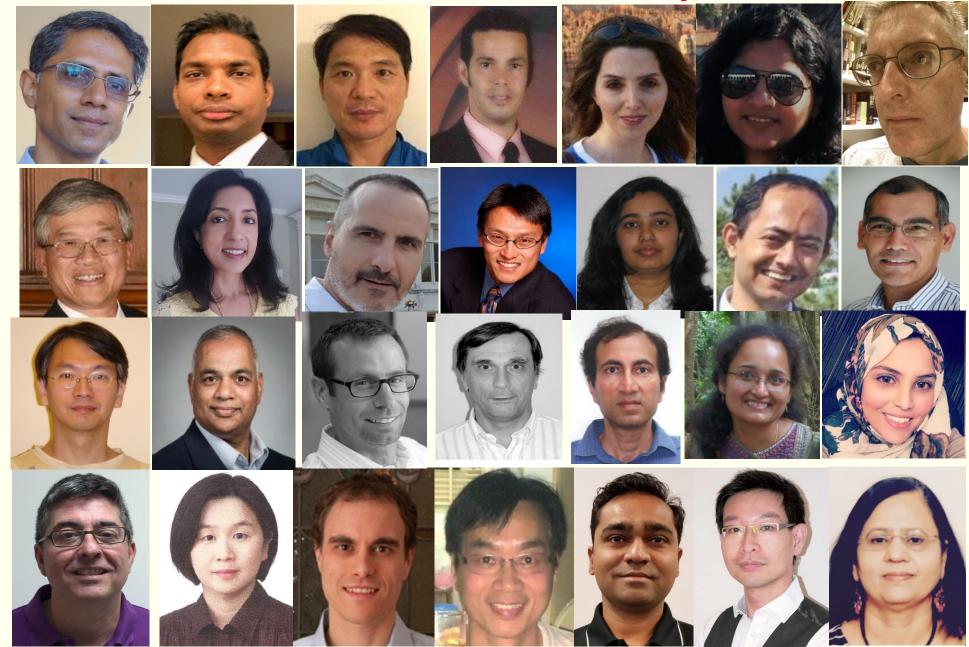
My 70+ Students
Who Performed Much of the

Research I am Recognized for

**Over the Past 35 Years** 



Thank You Some of those who made it all possible



# Representing them all here is Sameer Antani, Ph.D.



Sameer Antani: Video Content Characterization via Robust Recognition of Scene and Caption Text, Ph.D., 2001



# IAPR Leaders, Freeman, Fu, Sakai, and Pavlidis at First Meeting of the IAPR Governing Board, Kyoto, 1978





#### What is Graphics Recognition?

#### **A Typical Document: Three Components**

Text Regions - Recognized by OCR Images - Processed by Image Processing Graphics- Analyzed by Graphics Recognition

**Graphics include Block Diagram, Chart, Graph, Line Art, Map, Schematic, Table, etc.** 



#### **Graphics Recognition: 60 Year History**

**Early Days (1955) to First IJCPR (1973)** 

First IJCPR (1973) to First GRec (1995)

First GRec (1995) to Now (2017)

IJCPR: International Joint Conference on Pattern Recognition (Became ICPR after 1978)

**GRec: IAPR Workshop on Graphics Recognition** 



#### **Graphics Recognition – Early Days** 1955 - 1972

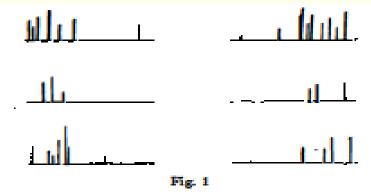


### "Pattern Recognition and Modern Computers" O. G. Selfridge, AFIPS '55 (Western) Proceedings, 1955

"Pattern Recognition... extraction of significant features from a background of irrelevant detail"

#### **Describes Following Problems**

Two Class Problem: Large group of VERTICAL LINES on LEFT or RIGHT



**Recognize Oriented Rectangles by Corner Detection** 



Conclusion: "simple visual patterns can be recognized by the computer, and ... may improve its recognition by learning"



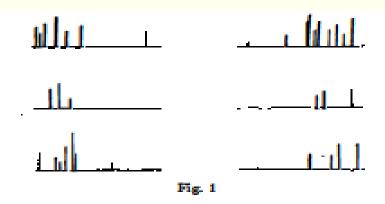
"Pattern Recognition and Modern Computers"

O. G. Selfridge, AFIPS '55 (Western) Proceedings, 1955

"Pattern Recognition... extraction of significant features from a background of irrelevant detail"

**Describes Following Problems** 

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**Recognize Oriented Rectangles by Corner Detection** 

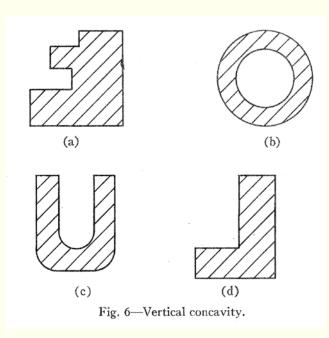


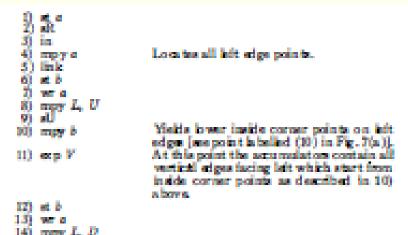


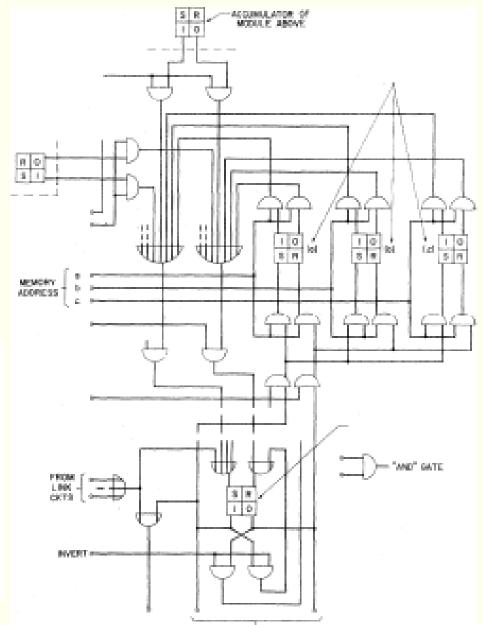
Conclusion: "simple visual patterns can be recognized by the computer, and ... may improve its recognition by learning"



# "A Computer Oriented Toward Spatial Problems", 1958 "Pattern Detection and Recognition", 1959 S. H. Unger, Proceedings of the IRE







#### "Apictorial Jigsaw Puzzles..."

#### H. Freeman and L. Garder, IEEE T. on Electronic Computers, 1964

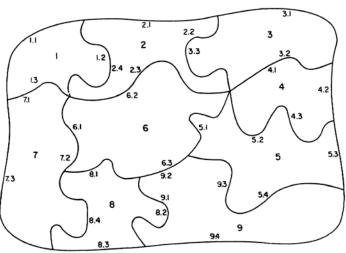
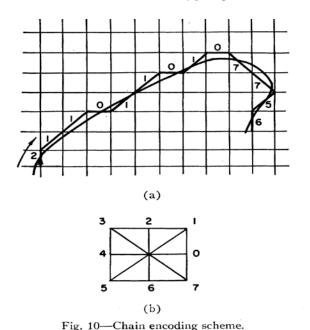


Fig. 4—Illustration of a jigsaw puzzle.



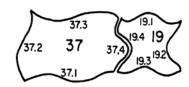


Fig. 13—Illustration of ambiguities.

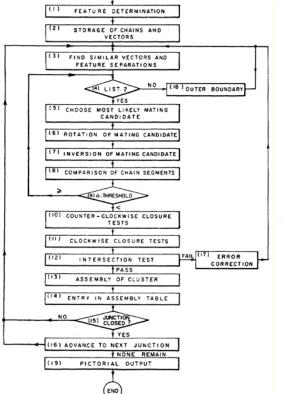


Fig. 14-Program flow chart.

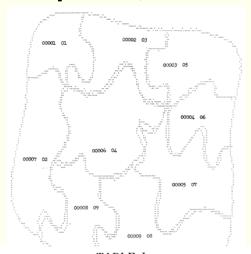


TABLE I Assembly Procedure for Illustrative Example

- Read Thresholds and Coefficients
- Border Routine
- Candidate Number 007.01
- Clockwise Closure Tests
- C-Clockwise Closure Tests
- 6) Intersection Test 1
- 7) Chain Number 007 Matched
- 8) Border Routine
- Candidate Number 002.02
- Candidate Number 002.04
- 11) Clockwise Closure Tests
- 12) C-Clockwise Closure Tests
- 13) Intersection Test 1
- 14) Intersection Test 2
- 15) Chain Number 002 Matched
- 16) Border Routine
- 17) Border Routine
- 18) Candidate Number 006.02
- Clockwise Closure Tests
- 20) Type 2/3 Clockwise Closure
- 21) C-Clockwise Closure Tests
- 22) Intersection Test 1
- 23) Intersection Test 2
- 24) Chain Number 006 Matched
- 25) Border Routine
- 26) Candidate Number 008.02
- Candidate Number 003.03
- 28) Clockwise Closure Tests
- C-Clockwise Closure Tests
- 30) Intersection Test 1
- 31) Chain Number 003 Matched
- 32) Border Routine
- 33) Border Routine 34) Candidate Number 004.01

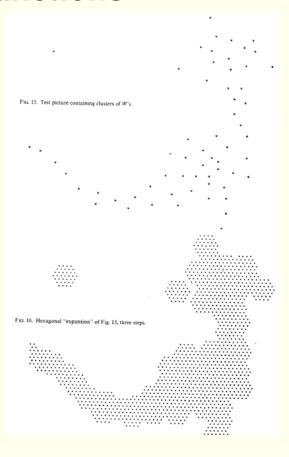
- 35) Clockwise Closure Tests
- C-Clockwise Closure Tests
- 37) Intersection Test 1
- 38) Intersection Test 2
- 39) Chain Number 004 Matched
- 40) Border Routine
- 41) Candidate Number 005.02
- 42) Clockwise Closure Tests
- 43) Type 2/3 Clockwise Closure44) C-Clockwise Closure Tests
- 45) Intersection Test 1
- 46) Intersection Test 2
- 47) Chain Number 005 Matched
- 48) Border Routine
- 49) Border Routine
- 50) Candidate Number 009.03
- 51) Clockwise Closure Tests
- Type 2/3 Clockwise Closure C-Clockwise Closure Tests
- 54) Intersection Test 1
- 55) Intersection Test 2
- 56) Chain Number 009 Matched
- 57) Border Routine
- 58) Border Routine 59) Candidate Number 008.02
- 60) Clockwise Closure Tests
- 61) Type 1 Clockwise Closure
- 62) Clockwise Closure Tests
- 63) Type 1 Clockwise Closure
- 64) Clockwise Closure Tests
- 65) C-Clockwise Closure Tests
- 66) Intersection Test 1
- 67) Chain Number 008 Matched
- 68) End of Assembly

# 1968: Pattern Recognition journal begins publication First issue includes the paper

#### "Distance Functions on Digital Pictures"

A. Rosenfeld and J. L. Pfaltz, Pattern Recognition, Issue 1, 1968

- Distances Functions
  - **Introduced** 
    - City Block
    - Square
    - Hexagonal
    - Octagonal
    - **■** Euclidean



Just Graduated with B. Eng
(Electrical)
Outstanding Student Award



#### "Recognition of Convex Blobs"

#### J. Sklansky, Pattern Recognition, 1970

- Relationships among convex figures, concave figures, and their cellular images on a rectangular mosaic are presented
- An algorithm using "minimum-perimeter polygon" is described for testing the convexity

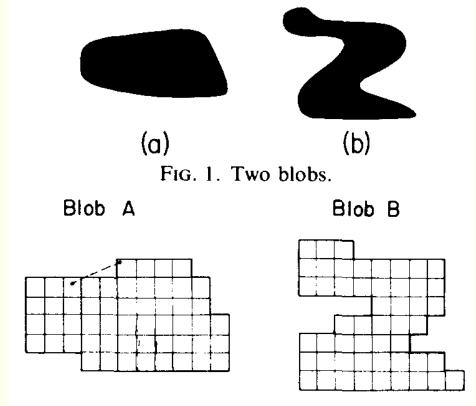


Fig. 2. Cellular images of the blobs of Fig. 1.



#### Graphics Recognition Growth to Become An Identified Scientific Discipline 1973 - 1994



#### **Graphics Recognition: 1970s**

Pattern Recognition gets Established as a Scientific Discipline during 1970s

Several Books on PR are Published

I(J)CPR, PRIP (CVPR), IAPR and PAMI All start during 1970s

#### **Graphics Recognition Topics frequently appear in these**



# Statistical, Syntactic, and Structural Methods in Pattern Recognition

Several Books were Published during 1973-78

"Pattern Classification and Scene Analysis"

R.O. Duda and P.E. Hart, Wiley, 1973

"Pattern Recognition Principles"

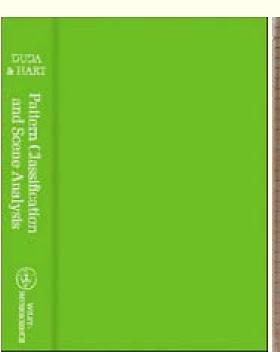
J.T. Tou and R.C. Gonzalez, 1974

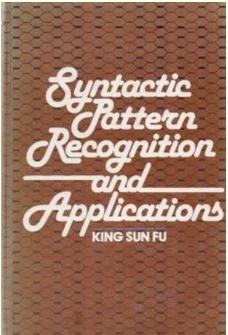
"Syntactic Methods in Pattern Recognition"

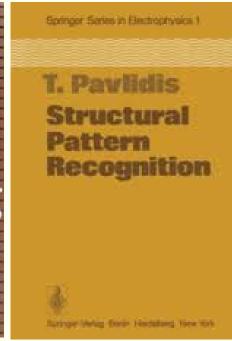
K.S. Fu, Academic Press, 1974

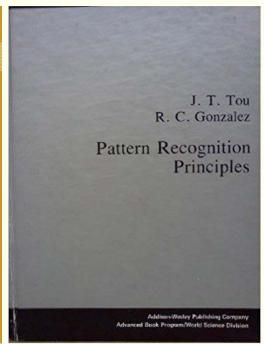
"Structural Pattern Recognition"

T. Pavlidis, Springer-Verlag, 1978







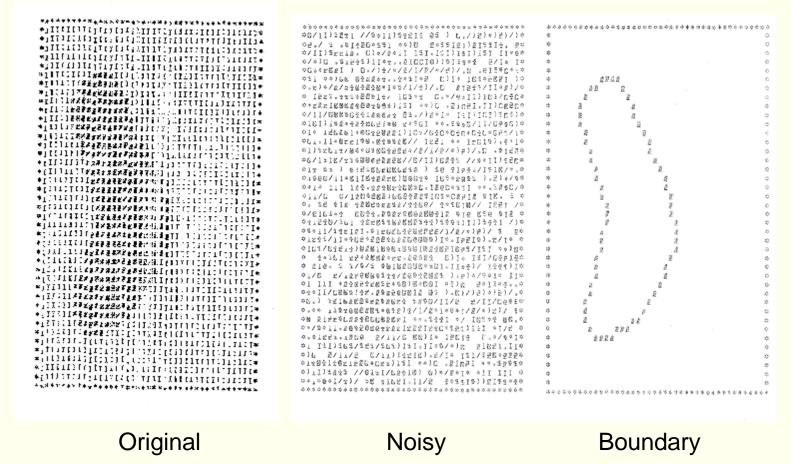




#### 1973: First International Joint Conference on Pattern Recognition

#### "Contour Detection in Noisy Pictures..."

#### A. Martelli, 1<sup>st</sup> IJCPR, 1973





# "Computer Processing of Line-Drawing Images" H. Freeman, Computing Surveys, 1974

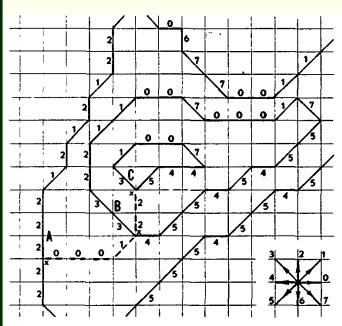


Fig. 13 Chain coding scheme (lower right), and some chain-coded boundary lines from Fig. 12

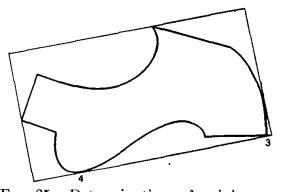


Fig 25 Determination of minimum-area rectangle

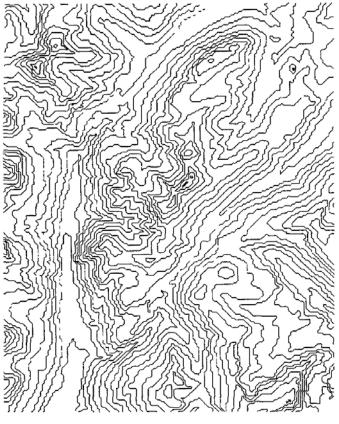


Fig. 24 Chain-encoded contour map. (From S. P Morse, "Generalized computer techniques for the solution of contour-map problems", Ph.D dissertation, New York University, 1967)



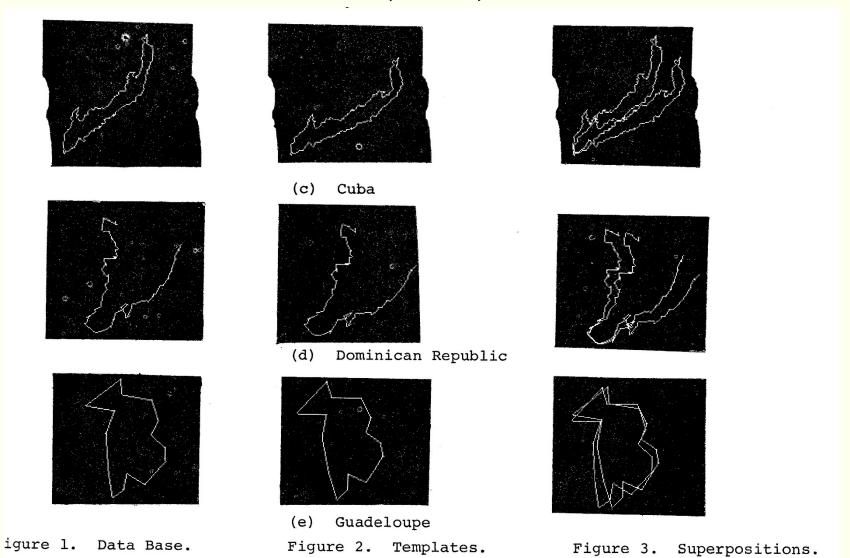
Fig 23. Illustration of the map-matching prob-



### IEEE Pattern Recognition and Image Processing PRIP Series Begins in 1977 (Changes to CVPR in 1983)

"Shape Matching using Relaxation Techniques"

**L.S.** Davis, PRIP, 1977





#### "Map Data Processing: Proceedings of NATO Workshop" Edited by H. Freeman and Pieroni, 1979



Edited by Herbert Freeman Goffredo G. Pieroni

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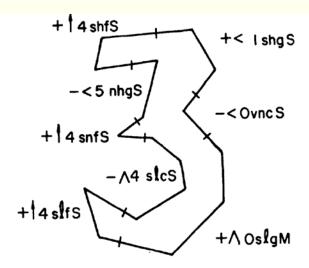
Michael F. Goodchild

#### IEEE T. PAMI First Paper Published in January 1979

IEEE TRANSACTIONS ON PATTERN ANALYSIS AND MACHINE INTELLIGENCE, VOL. PAMI-1, NO. 1, JANUARY 1979

#### A Hierarchical Syntactic Shape Analyzer

THEODOSIOS PAVLIDIS, SENIOR MEMBER, IEEE, AND FARHAT ALI



Example of encoding of the boundary of a handwritten numeral.

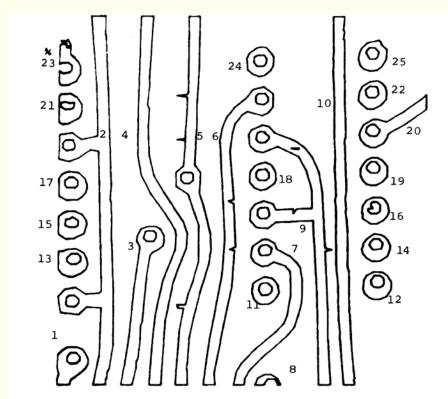


Fig. 5. Contours of a printed wiring board whose descriptions are given in Table IX. Note that the size notations in the table (L, M, S, N) are relative with respect to the size of the whole contour.



#### **Early work in Music Recognition**

#### "A Critical Survey of Music Image Analysis"

D. Blostein and H.S.Baird, Structured Document Image Analysis, Springer ,1992

#### A Comprehensive Survey of some 50 papers on Music Recognition including

- Recognition of Music Symbols
- Staff Lines
- Symbol Classification
- Relative Positions of Symbols
- Syntactic Methods (for analysis)
- Dance Notation

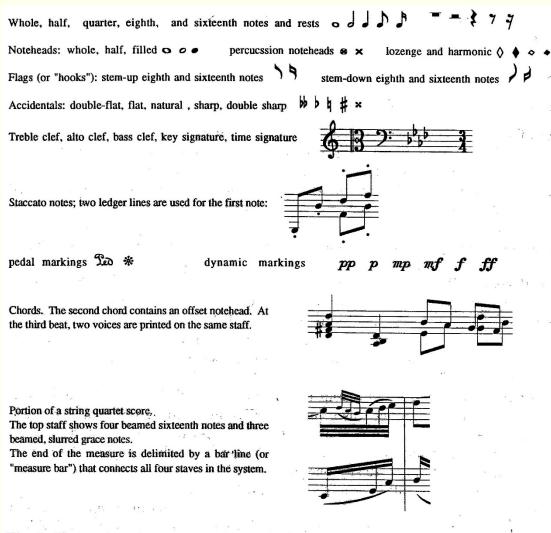
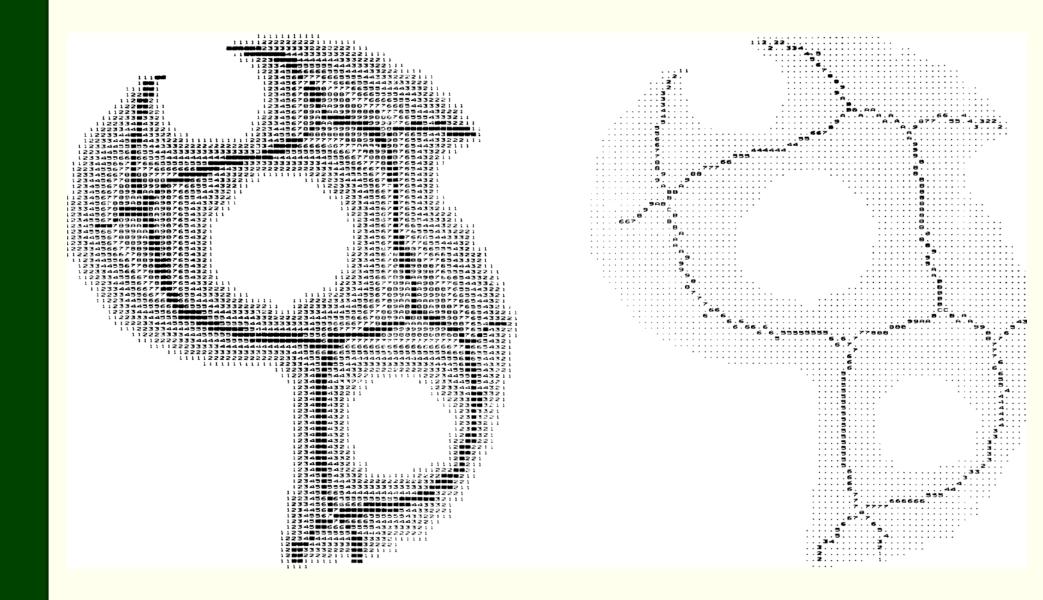


Fig. 2. Illustration of some terms for musical notation.



#### "A Width Independent Fast Thinning Algorithm" C. Arcelli and G. Sanniti di Baja, IEEE T. PAMI, 1985





#### IAPR S+SSPR Workshops

Workshop series on

Syntactic and Structural Methods in Pattern Recognition First event organized in 1981 by

K.S. Fu, T. Pavlidis, J.L. Mundy and J.K. Aggarwal

This complemented the Workshop series on Statistical Methods In Pattern Recognition
These are often held in the same location

(S+SSPR 2016 held in Mérida, Mexico)

\_\_\_\_\_

Kasturi-1981
Graduate Student at Texas Tech University
Topic: Image Restoration in Signal Dependent Noise





#### 1982: With John F. Walkup, Advisor

Joined the Pennsylvania State University Had to find a new topic for my research



#### **Always interested in MAPS**

Image Analysis Techniques for Cartographic Data Processing TECHNICAL ABSTRACT (LIMIT TO 22 PICA OR 18 ELITE TYPEWRITTEN LINES)
The objective(s) of this project is (are):

Design an intelligent computer based system to "understand" and extract information from cartographic data and answer queries related to spatial features and structure of geographical data. Image analysis techniques such as region growing, line tracking and representation using conic arcs and edge

Proposal submitted in January 1983; Grant for \$48,000 Received from National Science Foundation in April 1983 Finally, started working in Graphics Recognition!



#### Some Results from Map Analysis project (1983-87)

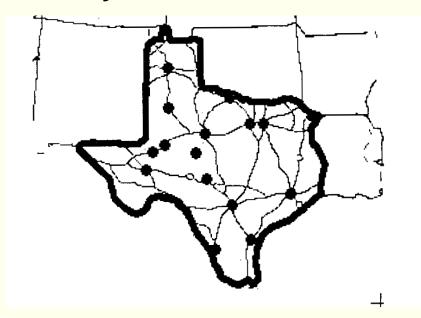
O. Morean and R. Kasturi, My First ICPR, Montreal, 1984 R. Kasturi and J. Alemany, IEEE TSE, 1988



Simplified Map of Western USA



Map after Text String Separation



Show "Roads" Within "State" Containing "Lubbock"

- Developed Algorithms for
  - Text-Graphics Separation
  - Symbol Recognition
  - Dashed Line Detection
  - Query Processing
  - Shortest Distance

R. Fernandez. who worked on this project, was hired to lead the Yahoo Maps project.

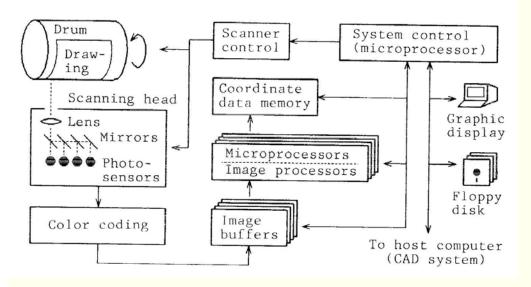


# "Development of Auto-Digitizer..." S. Kakumoto, T. Miyatake, S. Shimada, and M. Ejiri, CVPR 1983





Figure 3.10 Automatic digitizers: (a) drum-type for color drawings; (b) flatbed-type for monochrome drawings.



Hitachi Central Research Laboratory, Japan

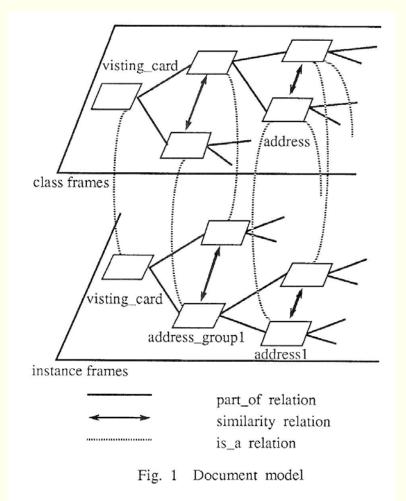


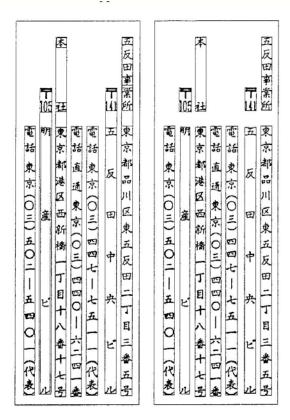
### IAPR Workshop on Machine Vision Applications, Tokyo,1990 Organized by Masakazu Ejiri

- Map and Line Drawing Processing
  - Raster-to Vector Conversion
  - Interpretation of Road Maps
  - Shorthand Recognition
  - Jigsaw Puzzle Assembly
  - Traffic Sign Detection
- Structured Document Recognition
  - Layout Structure Analysis
  - Page Reader
- **■** Fingerprint Classification



#### "Model based Understanding of Document Images" K. Kise, et al., IAPR MVA Workshop, 1990





(a) hypothesis generation (b) hypothesis testing

Fig. 2 Actual results

Table 2 Results of understanding

|                    | organization | position | title | name  | header | address | postcode | telephone | fax   | telex | total |
|--------------------|--------------|----------|-------|-------|--------|---------|----------|-----------|-------|-------|-------|
| No. of components  | 100          | 136      | 130   | 100   | 41     | 119     | 119      | 167       | 10    | 25    | 947   |
| Understanding rate | 81.0%        | 94.9%    | 98.5% | 89.0% | 87.8%  | 93.3%   | 82.4%    | 74.3%     | 20.0% | 84.0% | 86.5% |



#### "Automatic Digitizing of the Colour-Layer of Thematic Maps" R. Espelid, et al., IAPR MVA Workshop, 1990

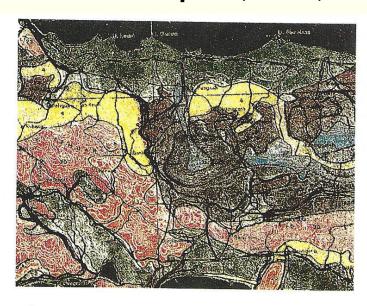
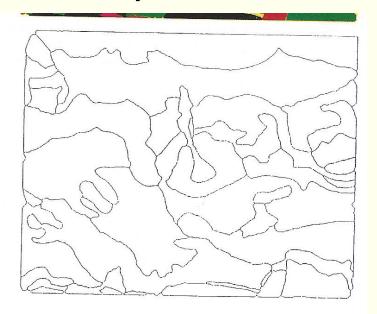


Figure 3. a) Original image. b) Thresholded image. c) Classified areas. d) Borderlines of classified areas.



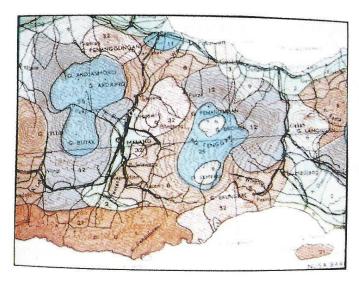
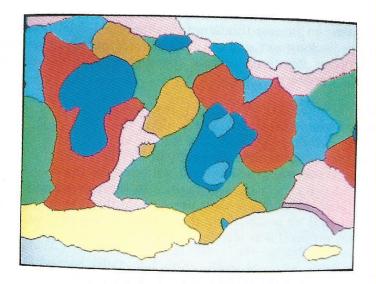


Figure 4. a) Original image. b) Classified image.





#### **IAPR TC10**

# From Map and Line Drawing Processing to Graphics Recognition

- TC10 on Map and Line Drawing Processing
  - Established during early years of IAPR
  - I was appointed as its Chair by President Martin Levine in 1988
    - First Experience in Leadership Activities
- Renamed as TC10 on Graphics Recognition in 1992 to broaden its appeal
- Provided a home for researchers with interest in Graphics Recognition to exchange their experiences
- Graphics Recognition became an Identified Scientific Topic



### General Purpose Graphics Recognition Project (1986-90) Test Image (1990 PAMI)

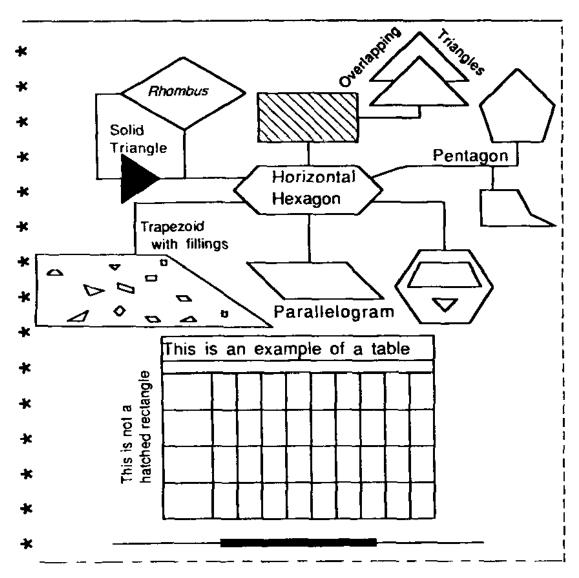
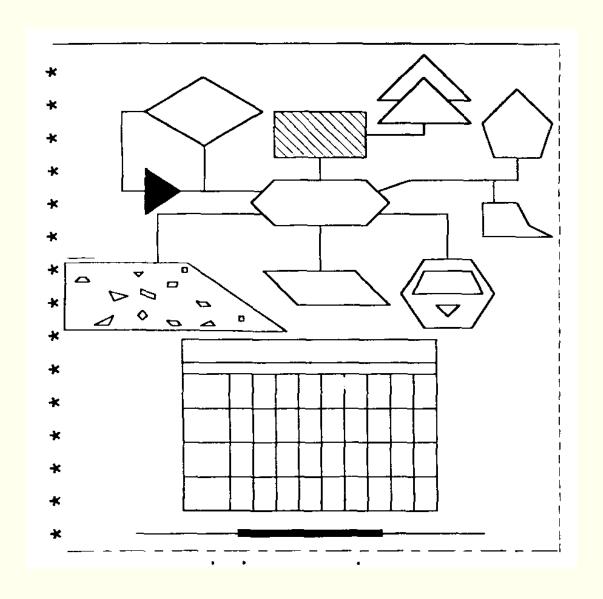


Fig. 1. Test image 1.

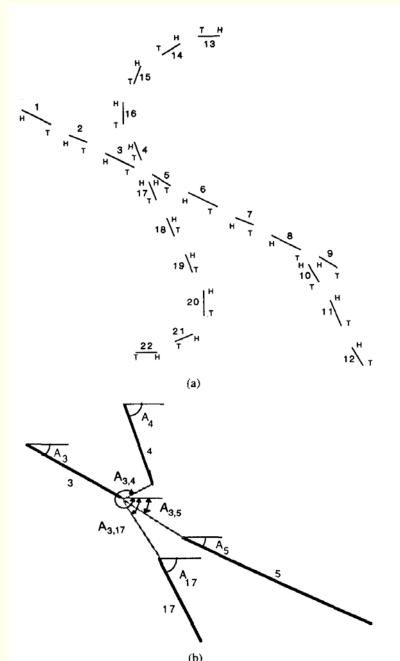


# **General Purpose Graphics Recognition Project After Text Separation**





### General Purpose Graphics Recognition Project Dashed Line Detection Algorithm



```
While there is a segment, L, which is not used in any line or tested for starting a new
  1: Select the "Head" end of Segment L by setting Terminal = 1
  2: Let S_0 = L and t_0 = Terminal
  3: Select an unmarked segment S, having the highest priority to continue the line at
         t_{\alpha} end of S_{\alpha}
         If S, exists, then
            Mark S<sub>i</sub>. Locate the other end of S<sub>i</sub>. If it is a head, then set t_i = I else set
            Go to Step 4
         elseif Terminal = 1 then
            Terminal = 2
            Go to Step 2 (to extend the line at the other end of starting segment L)
            Label all the segments which belong to the current line
            Clear all marks of segments which are not part of a dashed line
            Continue to find other lines (by returning to the While loop)
         end if
  4: Select an unmarked segment S, having the highest priority to continue the line at
         t, end of S,.
         If S<sub>2</sub> exists, then
            Mark S,
            If l_{so} \neq l_{s2} Or g_{01} \neq g_{12} then Go to Step 4
            Locate the other end of S<sub>1</sub>. If it is a head, then set t_1 = 1 else set t_2 = 2
            Go to Step 5
         else
            Go to Step 3
         end if
   5: Select an unmarked segment S, having the highest priority to continue the line at
         t_2 end of S_2
         If S, exists, then
             Mark S.
            If l_{s1} \neq l_s, Or g_{12} \neq g_{23}, then Go to Step 5.
            Locate the other end of S<sub>i</sub>. If it is a head, then set t_i = 1 else set t_i = 2
            Label S, and S, as extensions of current line. Set S_0 = S_2, t_0 = t_2, S_1 = S_2
            and t_1 = t_1.
         end if
   6: Go to Step 4
 end while
```

### General Purpose Graphics Recognition Project Recognition of Shapes and their Attributes

TABLE IV
RECOGNIZED SHAPES AND POLYGONS IN TEST IMAGE 1

| <del></del> - |                    |  |
|---------------|--------------------|--|
|               | Object             | Attributes   |
| 1             | Regular Hexagon    | P: (1258, 1081), L = 133, Ø = 1.51   |
| 2             | Parallelogram      | P: $(727, 1268)$ , L1 = 292, L2 = 146, $\Theta$ = 46.1, $\emptyset$ = 0                                |
| 3             | Trapezoid          | P: $(73, 1081)$ , L1 = 718, L2 = 390, H = 217, $\Theta$ = 90.68, $\emptyset$ = -0.16                   |
| 4             | Rhombus            | P: (339, 1791), L = 220<br>$\Theta$ = 30.1, $\phi$ = -0.45   |
| 5             | Trapezoid          | P: (1220, 1194), L1 = 221, L2 = 150,<br>H = 68.6, $\Theta$ = 65, $\emptyset$ = 0.77                    |
| 6             | Triangle           | P1: (1295, 1153), P2: (1363, 1151),<br>P3: (1325, 1122), Isoceles                                      |
| 7             | Triangle           | P1: (1396, 1826), P2: (1106, 1831),<br>P3: (1256, 1971), Isoceles                                      |
| 8             | Rectangle          | P: (457, 1044), W = 835, H = 564,<br>Ø = -0.4, Table   |
| 9             | Quasi-Hexagon      | P: (692,1497), L1 = 440, L2 = 303,<br>Θ = 89.1, Ø = 3.0  |
| 10            | Parallelogram      | P: (765, 1790), L1 = 297.1, L2 = 148, $\Theta$ = 89.0, $\phi$ = -1.35, Single hatch: a1 = 135, d1 = 30 |
| 11            | Traingle           | P1: (1256, 1897), P2: (1399, 1755),<br>P3: (1108, 1753), Isoceles                                      |
| 12            | Polygon, irregular | Number of segments: 6,<br>Center: (1556, 1706),<br>Coordinates of vertices                             |

TABLE V
SPATIAL RELATIONSHIPS AMONG OBJECTS IN TEST IMAGE 1

|      | Objects  | Spatial Relationships         |  |       |    |
|------|--|-------------------------------|--|-------|----|
| 11   | Triangle   |                               | Overlaps Object 7                        |       |    |
| 1    | Regular Hexagon  | 1                             | Encloses Objects 5 and 6                 |       |    |
| 10   | Parallelogram  |                               | Single Hatch                             |       |    |
| 3    | Trapezoid  |                               | Small Shape Fillings                     |       |    |
|      | Lines and Th   | eir I                         | nterconnec                               | tions |    |
| Line | Head Tail  |                               |  | From  | То |
|      | Single   | Segn                          | ent Lines                                |       |    |
| L1   | (1404,1748)  | 748) (1399,1755)              |  |       | 11 |
| L2   | ( 910,1416)  | ( 911,1271)                   |  | 9     | 2  |
|      | •  |                               |  | . •   |    |
|      |  |                               |  |       | •  |
|      | Lines With   | Multi                         | ple Segme                                | nts   |    |
| PL1  | S1: ( 330,1531)<br>S2: ( 260,1537)<br>S3: ( 265,1791)<br>S4: ( 332,1790) | ( 26:<br>( 33:                | 0,1537)<br>5,1791)<br>2,1790)<br>9,1791) |       | 4  |
| PL2  | S1: (1064,1715)<br>S2: (1252,1719)                                       | (1252,1719) 10<br>(1252,1750) |  | 10    | 11 |
|      |  |                               |  |       |    |



#### **Processing Graphics Containing Circular Arc Segments**

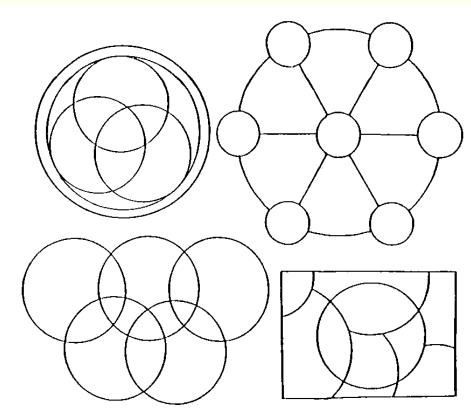


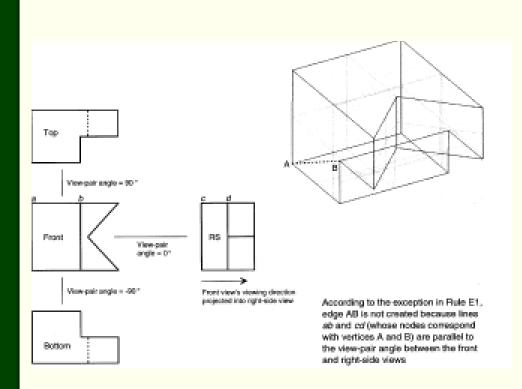
Fig. 16. Graphics containing circular arc segments.

#### CIRCLES DETECTED IN FIG. 16

| CIRCLE      | RADIUS    | CENTER             |      |  |
|-------------|-----------|--------------------|------|--|
|             |           | Х                  | Υ    |  |
| 1           | 381       | 493                | 469  |  |
| 2           | 228       | 1193               | 890  |  |
| 2<br>3      | 230       | 1195               | 257  |  |
| 4           | 338       | 495                | 473  |  |
| 5           | 221       | 1472               | 687  |  |
| 5<br>6<br>7 | 233       | 1455               | 415  |  |
| 7           | 236       | 1418               | 1548 |  |
| 8           | 233       | 1180               | 591  |  |
| 9           | 95        | 917                | 1647 |  |
| 10          | 210       | 596                | 554  |  |
| 11          | 209       | 368                | 463  |  |
| 12          | 98        | 129                | 1654 |  |
| 13          | 97        | 529                | 1864 |  |
| 14          | 96        | 906                | 1190 |  |
| 15          | 92        | 125                | 1207 |  |
| 16          | 96        | 509                | 980  |  |
| 17          | 210       | 548                | 359  |  |
| 18          | 97        | 519                | 1422 |  |
| 19          | 457       | 509                | 1422 |  |
|             | Circle 19 | is partially occlu | ded  |  |



### Interpretation of 3-D from Orthographic Projections P.M. Devaux, D.B. Lysak, and R. Kasturi., ICPR 1990, IJDAR 1999



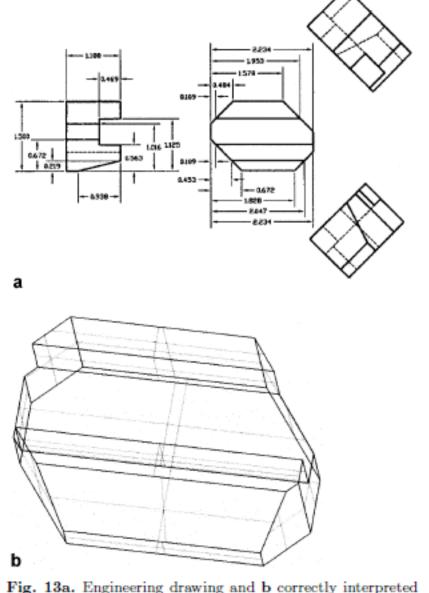
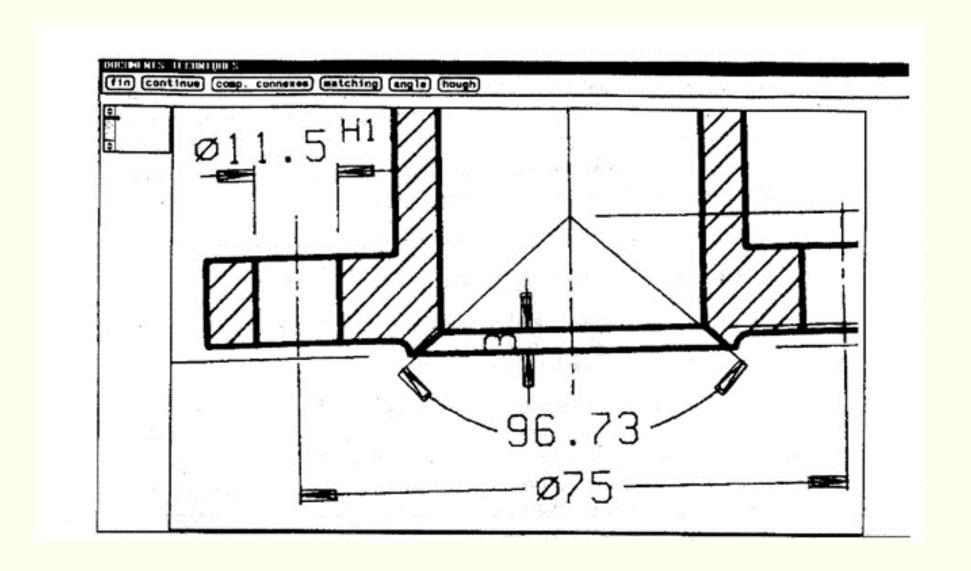


Fig. 13a. Engineering drawing and b correctly interpreted object

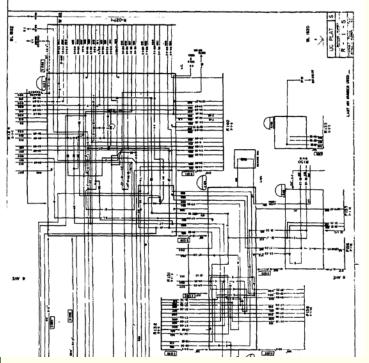


### "Engineering Drawing Conversion: Arrow Detection" Antoine, Collin, and Tombre, SSPR 1990



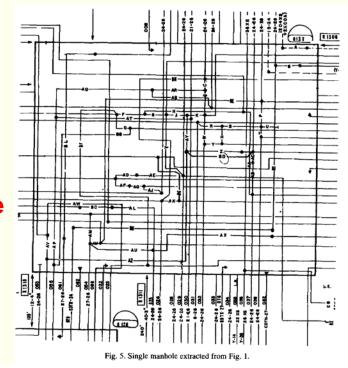


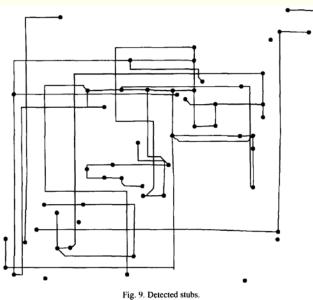
### "Interpretation of Telephone System Manhole Drawings" Arias, Lai, Surya, Kasturi, and Chhabra, PRL, 1994



**Original Drawing** 

**Extracted Manhole** 





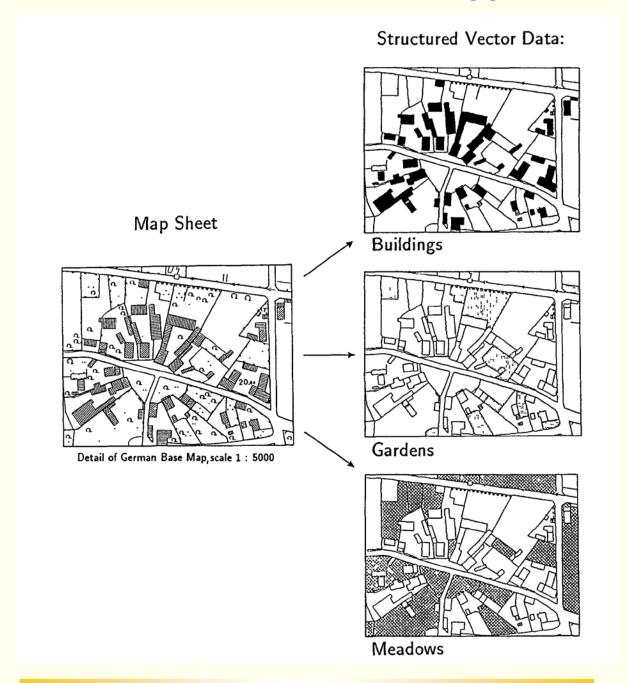
**Cable Connections** 

**Summary Table** 

| Cables and Stubs |       |         |         |       |       |           |           |
|------------------|-------|---------|---------|-------|-------|-----------|-----------|
| Line#            | type  | start_x | start_y | end_x | end_y | end_1     | end_2     |
| 1                | cable | 87      | 25      | 1299  | 581   | open      | splice#44 |
| 2                | cable | 151     | 25      | 1383  | 205   | open      | splice#47 |
| 3                | cable | 681     | 25      | 681   | 1137  | open      | splice#20 |
| 4                | cable | 1253    | 25      | 1253  | 469   | open      | splice#43 |
| 5                | cable | 590     | 27      | 590   | 1226  | open      | splice#11 |
| 6                | cable | 900     | 27      | 900   | 889   | open      | splice#30 |
| 7                | cable | 1032    | 27      | 1032  | 624   | open      | splice#34 |
| 8                | cable | 1120    | 27      | 1120  | 911   | open      | splice#37 |
| 9                | cable | 1169    | 27      | 1169  | 914   | open      | splice#40 |
| 10               | cable | 1212    | 27      | 1212  | 403   | open      | splice#42 |
|                  |       |         |         |       |       |           |           |
|                  | •     |         |         |       |       |           |           |
| 71               | stub  | 1383    | 205     | 1529  | 204   | splice#47 | splice#5  |
| 72               | stub  | 1529    | 204     | 864   | 1067  | splice#53 | splice#2  |
| 73               | stub  | 653     | 251     | 1565  | 247   | splice#18 | splice#5  |
| 74               | stub  | 653     | 251     | 658   | 1094  | splice#18 | splice#1  |
| 75               | stub  | 260     | 494     | 1402  | 305   | splice#3  | splice#4  |
| 76               | stub  | 1337    | 364     | 1349  | 1616  | splice#45 | splice#4  |
| 77               | stub  | 1212    | 403     | 1211  | 604   | splice#42 | splice#41 |
| 78               | stub  | 1253    | 469     | 1431  | 470   | splice#43 | splice#5  |
| 79               | stub  | 1431    | 470     | 1472  | 864   | splice#51 | splice#5  |
| 80               | stub  | 1431    | 470     | 1429  | 536   | splice#51 | splice#5  |
|                  |       |         |         |       |       |           |           |

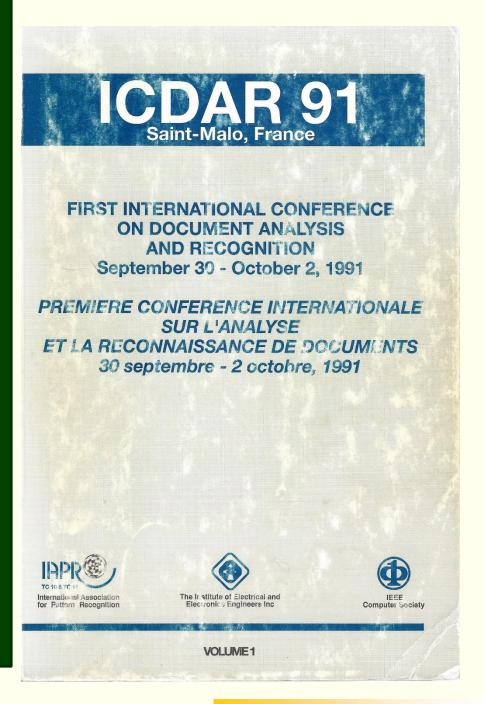


#### "Automatic Digitization of Large Scale Maps" Andreas Illert, ACSM-ASPRS, Vol. 6, pp. 113-122,1991





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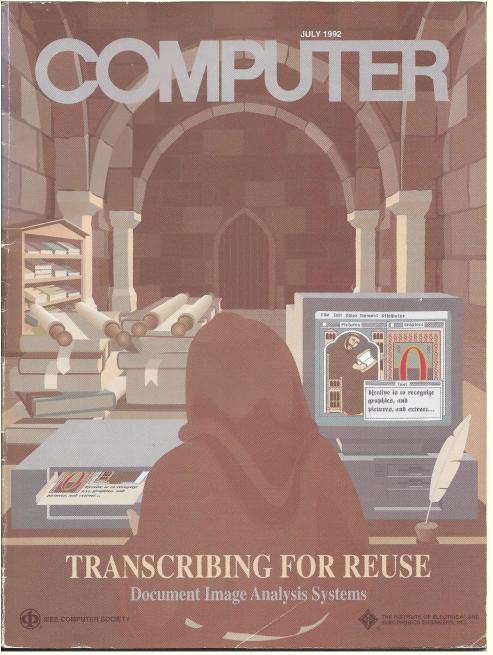
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#### **Special Issue of IEEE Computer 1992**

#### L.O'Gorman and R. Kasturi, Editors

July 1992 • Vol. 25, No. 7



#### **ARTICLES**

**Guest Editors' Introduction: Document Image Analysis Systems** 

Lawrence O'Gorman and Rangachar Kasturi

#### A Prototype Document Image Analysis System for Technical Journals

George Nagy, Sharad Seth, and Mahesh Viswanathan

Intelligent document segmentation can bring electronic browsing within the reach of most users. The authors show how this is achieved through document processing, analysis, and parsing the graphic sentence.

#### An Interpretation System for Land Register Maps

Luca Boatto, Vincenzo Consorti, Monica Del Bueno, Silvare Di Zenzo, Vincenzo Eramo, Alessandra Esposito, Francesco Melcarne, Marco Mexcest Ambrea Morelli, Marco Mosciatti, Stefano Scarci, and Marco Tucci

The semantics of land register maps drive this document conversion system. However, its methods of image representation, vectorization, and symbol recognition can be generalized to other classes of line drawings.

#### Postal Address Block Location in Real Time

Paul W. Palumbo, Sargur N. Srihari, Jung Soh. Ramalingam Sridhar, and Victor Demjanenko A postal automation system locates destination address blocks on letter mail pieces with a high success rate. Pipelining and multiprocessor techniques achieve real-time processing speed,

#### Celesstin: CAD Conversion of Mechanical Drawings

Pascal Vaxivière and Karl Tombre

A prototype CAD conversion system extracts higher level structures for knowledgebased analysis. It recognizes such entities as screws, ball bearings, and shafts.

#### **PROJECT OVERVIEWS**

- A Robust Recognition System for a Drawing Superimposed on a Map Shigevoshi Shimotsuji, Osamu Hori, Mieko Asano, Kaoru Suzuki, Fumihiko Hoshino,
- Reading Handwritten Digits: A ZIP Code Recognition System Ofer Matan, Henry S. Baird, Jane Bromley, Christopher J.C. Burges, John S. Denker, Lawrence D. Jackel, Yann Le Cun, Edwin P.D. Pednault, William D. Satterfield, Charles E. Stenard, and Timothy J. Thompson
- From Paper to Office Document Standard Representation Andreas Dengel, Rainer Bleisinger, Rainer Hoch, Frank Fein, and Frank Hönes

A Workstation-Based Document Recognition System for Text Entry

Tomio Amano, Akio Yamashita, Nobuyasu Itoh, Yoshinao Kobayashi, Shin Katoh, Kazuharu Toyokawa, and Hiroyasu Takahashi

Off-Line Arabic Character Recognition

Habib Goraine, Mike Usher, and Samir Al-Emami

**Understanding Diagrams in Technical Documents** 

Robert P. Futrelle, Ioannis A. Kakadiaris, Jeff Alexander. Catherine M. Carriero, Niko Nikolakis, and Joseph M. Futrelle



#### Special Issues of MVA Journal, 1992, 1993

R. Kasturi and L.O'Gorman, Editors

# Machine Vision and Applications

An International Journal

Volume 5, Number 3 Summer 1992

> Editors-in-Chief Masakazu Ejiri Ramesh Jain André Oosterlinck Jorge Sanz Jack Sklansky

Special Issue: Document Image Analysis Techniques





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138 ISSN 0932-8092 Machine Vis. Apps. 5(3) 141-248 1992 Printed on acid-free paper

### Machine Vision and Applications

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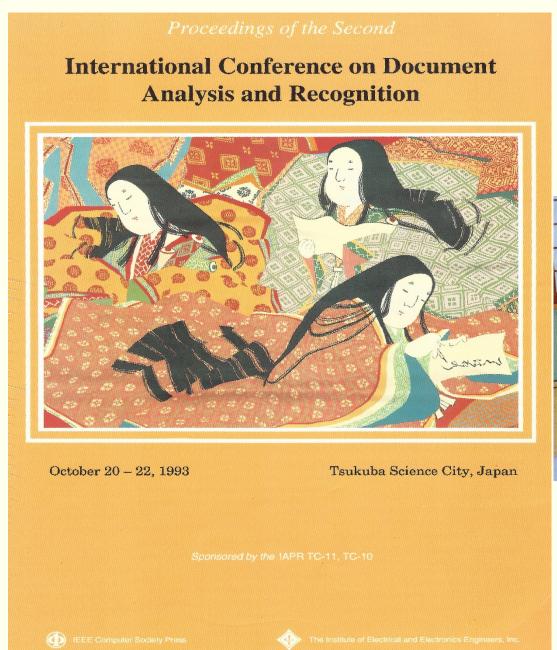
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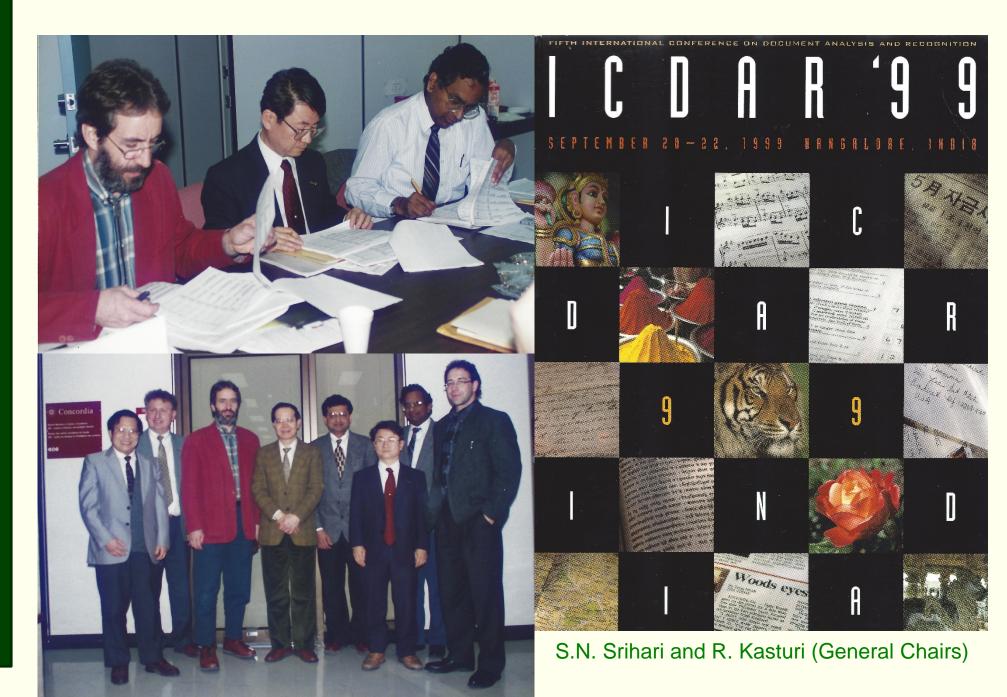




Organized by Kazuhiko Yamamoto



#### Next Three: Montreal,1995; Ulm 1997; and Bangalore,1999



USF UNIVERSITY OF SOUTH FLORIDA

## **Graphics Recognition – Recent Progress**1995 - Present



#### First International Workshop on Graphics Recognition August 9-11, 1995 Pennsylvania USA

### **Session Topics**

- Basic Techniques and Symbol-level Recognition
- Map Processing
- Engineering Drawings
- Applications of Graphics Recognition
- Performance Evaluation

**Dashed Line Detection Contest** 



#### **GRec Contests**

- 1995: Dashed Line Detection
- 1997: Raster to Vector Conversion
- 2001: Arc Segmentation
- 2003: Symbol Recognition
- 2005: Symbol Recognition II
- 2007: Symbol Recognition III
- 2009: Arc Segmentation II
- 2011: Isolated Symbol Recognition and Symbol Spotting
- 2013: Music Scores Competition: Staff Removal
- 2013: Arc and Line Segmentation
- 2015: Engineering Drawing Challenge I
- 2017: Engineering Drawing Challenge II





# **GRec 1995 State College Pennsylvania**





Dov Dori receiving Dashed Line Detection Award (Winning Team: D. Dori, L. Wenyin and M. Peleg)



### **Document Image Analysis Tutorial Text**



### DOCUMENT IMAGE ANALYSIS

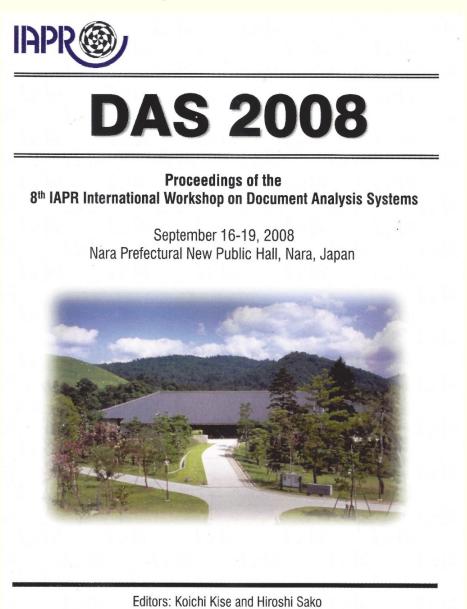
Lawrence O'Gorman Rangachar Kasturi







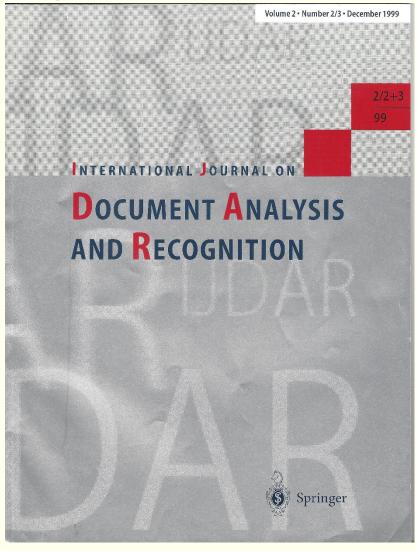
### Document Analysis Systems Workshops Begin in 1994



#### **International Journal on**

### **Document Analysis and Recognition**

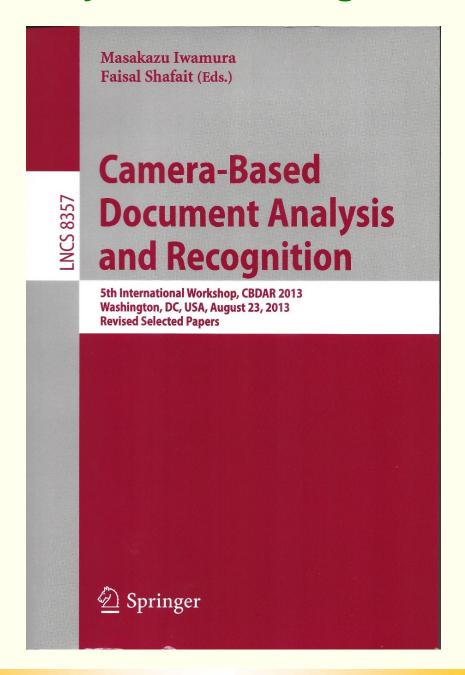
#### **Begins Publication in 1998**



Current Editors-in-Chief: K. Kise; D. Lopresti; S. Marinai Foundaing Managing Editor: David Doermann



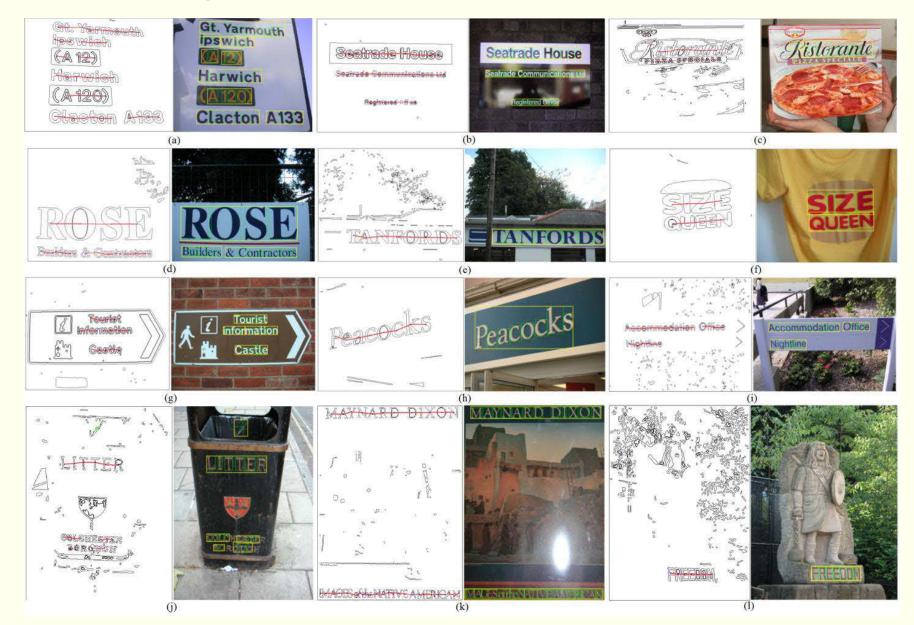
## New Workshop on Camera-Based Document Analysis and Recognition since 2005





### Text Detection in Video/Images: An Example

J. Zhang and R. Kasturi, CBDAR 2013 and IEEE TIP 2014



**Results on 2003-05 ICDAR Dataset** 



### Grec 1995 to 2017

- **GREC 2017, Kyoto** 
  - 27 papers organized into 6 sessions
  - Interpretation of engineering drawings, maps, charts, etc.
  - Symbol Recognition and Spotting
  - Optical Music Recognition
  - Interpretation of drawings, music scores, tables, etc.
  - Raster to Vector and drawings
  - Performance Evaluation and Interpretation
  - **Engineering Drawing Challenge II**
- GREC 1995, State College, Pennsylvania
  - Basic Techniques and Symbol-level Recognition
  - Map Processing
  - Engineering Drawings
  - Applications of Graphics Recognition
  - Performance Evaluation

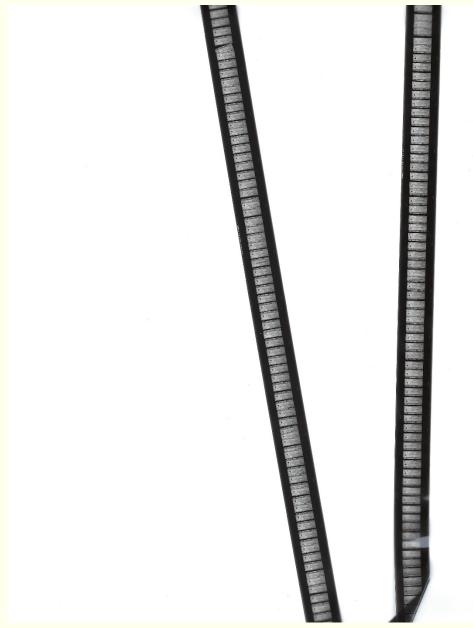


### **Graphics Recognition Today**

- ■Some 250 papers on GR Topics since 2007
- Fewer papers in Raster to Vector Conversion, Map Analysis, Tables, etc.
- Continuing interest in Music Recognition and Historical Document Analysis
- ■Increased interest in analyzing natural Video/Image data captured by cameras
- Much Interest: Sketch or Example-driven Recognition (SIGGRAPH/EuroGraphics, Multimedia and CBIR Communities are Ahead of us).



Historical Documents: An Example From U.S. National Archives



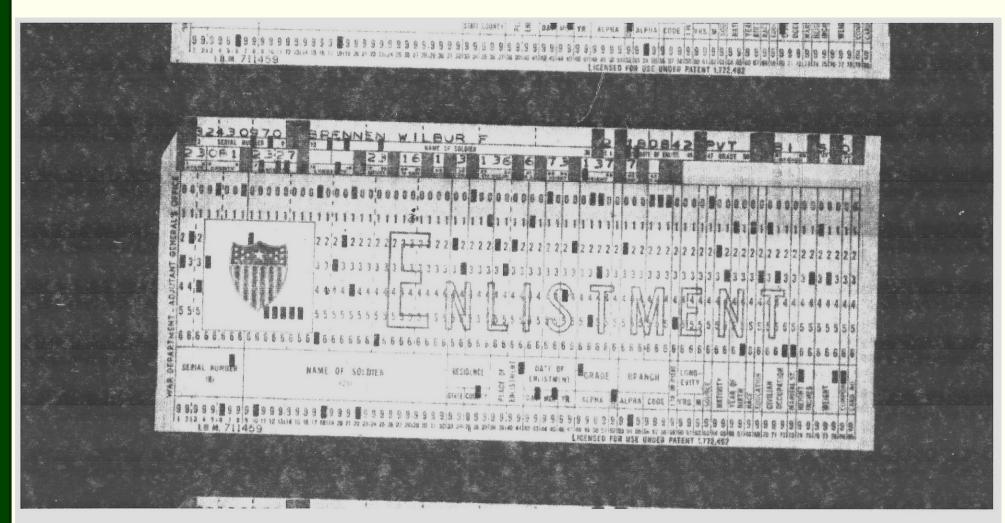


### **Historical Documents: One Example**





# Text from Microfilm Images of Punched Cards An Example of Historical Document Processing S.Kumar and R. Kasturi, ICPR 1992



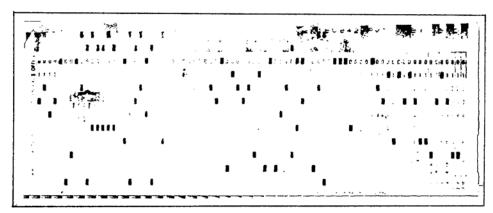
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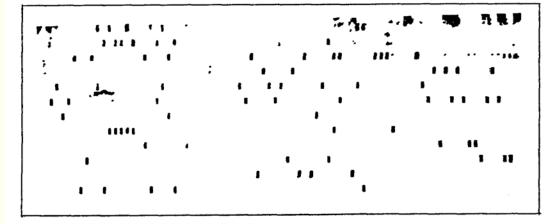


#### **Processing Steps**



**Skew Correction** 

#### **Morphological Processing**



**Final Image** 

**Decoded Text** 

32430970BRENNEN-WILBUR-F-----23181232

7 1 8 0 8 4 2 P V/N\* T - 8 2 9 - 0 0 0 0/5\* - - - 0 2 3 1 6 0/1\* 3 1 3 0/6\* 0/6\* 7 3 0/1\* 0/3\* 0/7\* 0/7\* -



# One Final Thought: Do we need an Open GR?

- ■We have seen the impact of Open CV in accelerating Computer Vision research.
- But most Graphics Recognition applications appears to be still built from scratch.
- ■Should we invest in developing an Open GR?
  - ■Perhaps contribute to adding Graphics Recognition tools to Open CV?
  - ■Build upon Other Initiatives such as Aletheia?



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**U.S. States of Florida and Pennsylvania** 



## Thank You Research Collaborators

**Terri Ashmeade Sing-Tze Bow Octavia Camps Dmitry Goldgof** Lawrence Hall Ramesh Jain **Soundar Kumara** Ravi Sankar **Sudeep Sarkar** Rajeev Sharma **Leon Sibul** Yu Sun



## Questions?





W. El-Masri: Recognition and Description of Graphical Primitives, MSEE, 1988





J. Min: Human Activity Recognition Using Motion Trajectories, Ph.D., 2005





D. Crandall: Detection of Stylized Text in Video, M.S. CSE and BS (Honors), May 2001





Y.L.Tang: An Airborne System for Runway Recognition and Obstacle Detection, Ph.D., August 1994





H. Vajaria: Localization and Identification of Participants in Meeting Archives, Ph.D., 2008





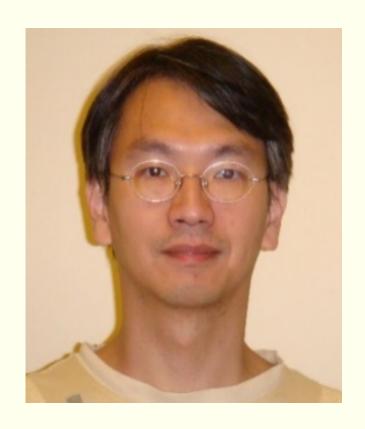
J. Zhang: Extraction of Text Objects in Image and Video Documents, Ph.D. 2012





H. Halliyal: Speech Recognition System for Kannada Language, MSEE, 1987





M. Yang: An Automatic Scheduler for Real-time Vision Applications, Ph.D., Dec. 2000





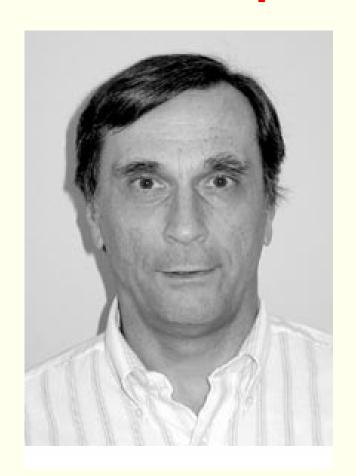
U.B. Mokate: An Algorithm for Recognition of Circles in Graphics, MSEE, 1988





P. Devaux: Experimental Verification of Automated Interpretation of Engineering Drawings, MSEE, May 1995





D.B. Lysak: Interpretation of Engineering Drawings of Polyhedral and Non-polyhedral Objects, Ph.D., 1991





S. Antani: Video Content Characterization via Robust Recognition of Scene and Caption Text, Ph.D., 2001





S.Chandran: Structural Recognition of Tabulated Data, MSCmpE, 1993





G. Zamzmi: Infant Pain Analysis, Ph.D. 2018 Ph.D. Candidate





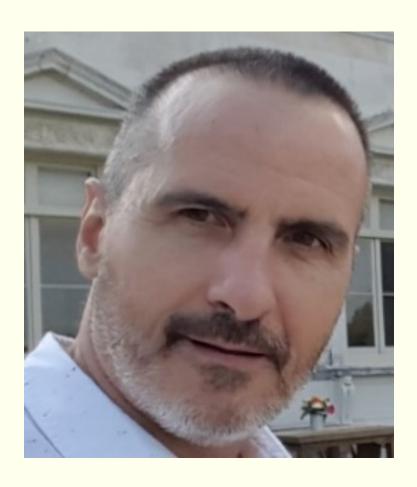
H.T. Liang: Automatic Searching of Shortest Path in Maps, 1988





A. Prasad: System for Intelligent Interpretaion of Text from Telephone Company Drawings, MSCmpE, August 1995





J. Arias: Efficient Techniques for Line Drawing Interpretation, PhD, August 1995





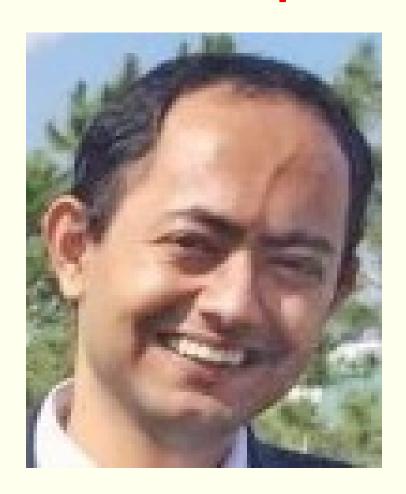
W.C. Feng: A Learn-By-Example Natural Language Processor, MSCmpE, 1990.





N. Muralidhar: Collection of Training Data for OCR of Kannada Characters, 1999





S. Hinduja: Pedestrian Detection in Low Quality Moving Camera Videos, MS, 2016,





R.J. Fernandez: Extraction of Feature Overlays for Query Processing in a Geographic Information System, MSEE, 1989.





U. Gargi: Visual Content Characterization of Images and Video, Ph.D., Dec. 1999





P.K. Mohanty: Learning from Biometric Distances Performance and Security Related issues in Face Recognition, Ph.D., 2007





J.H. Park: Manifold Learning in Computer Vision, Ph.D., 2005





J. Candamo: Boundary Profile Representation for Objects and Their Surroundings in Outdoor Videos, Ph.D. 2009





M. Fathollahi: Estimation of human pose categories, Ph.D. 2017





J. Viswanathan, Continuous Identity Assurance, MS, 2016





T. Gandhi: Image Sequence Analysis for Object Detection and Segmentation, Ph.D., May 2000





L.A. Fletcher: Automated Text String Separation from Mixed Text/Graphics Images, MSEE, 1986



- A. Modi, Pedestrian detection at traffic intersections, MS, 2017
- V. Kamath, Survival prediction for colon cancer patients, M.S., 2005
- V. Mariano, Video Object Detection and Matching, Ph.D., 2003
- P.Tofani, Segmentation of Text from Color Map Images, MS, 1998
- S.Devadiga, *Detection of Obstacles in Monocular Image Sequences*, Ph.D., 1997
- S.Natarajan, A Hierarchical Scheme for Invoice Classification, MS, 1997
- S.Balasubramanian, Information Extraction From Tabular Drawings, MSEE, May 1994
- C.P.Lai, *Knowledge-based Understanding of Engineering Drawings*, Ph.D., June 1993
- S.U.Kumar, Text Data Extraction from Microfilm Images of Punched Cards, MS, 1992



- S.C.Chennubhotla, Pose Clustering on Constraints for Object Recognition, MS, 1991
- R.Raman, Beautification of Hand-drawn Line Drawings, MS, 1990
- M.Amlani, A Query Processor for Map-based Information System, MS, 1989
- D.Amamoto, *Tissue-type Discrimination in MR Images*, MS, 1989
- J.Shah, Vector Representation of Raster-Scanned Images, MS, 1988.
- J.R.Gattiker, An Improved Algorithm for Text Segmentation in Mixed Text/Graphics Documents, MS, 1988.
- C.C.Shih, *Encoding Method for Graphics Applications*, MS, 1987.
- A.R.Jham, Application of the SVD and Wigner-Ville Distribution, MS, 1986
- B.S.Satyanarayana, A Frame Grabber System for Color Image Capturing, MS, 1986
- J.Alemany, An Image Processing System for Interpretation of Paperbased Maps, MS, 1986



- T.J.Amin, A Computer-Based System for Cartographic Data Interpretation, MS, 1985
- R.L.Tutwiler, Adaptive Restoration of Atmospherically Degraded Images, MS, 1985
- H. Luo, Interpretation of Lines in Distributing Frame Drawings, MS, 1998
- G.Shashikumar, Analysis of Video Images for Automated Indexing, 1994
- J.Tyson, Classification and Recognition of Invoice Documents, 1993
- S.Siva, Efficient Extraction of Polygonal Shapes from Document Images, 1991
- C-H.Chen, Recognition and Description of Two-Dimensional Shapes in a Line-Drawing Image, 1991
- E.Yeh, Applications of Digital Image Processing Techniques to the Automated Diagnoses of Human Brain, 1991
- Y-M.Chen, A Users' Manual for VAX PHIGS Software, 1991
- Y.Nadarajah, Architectures for Image Processing, 1988



- G.A.Jividen, A Survey of Image Processing Techniques for Angiograms, 1988
- W.K.Sze, An Interface Card for AT&T 3B2 Computer, 1987
- M.I.Kahn, Collision Free Path Planning in Unstructured, Dynamic Environments for Mobile Robots and Manipulators, 1987
- Y.Choe, Two-Dimensional Multiresolution Matching Algorithm, 1987
- J.Yi, Edge Detection Techniques A Survey, 1987
- M.C.Chen, *Thresholding and Edge Detection Techniques in Computer Vision*, 1987
- R.T.Yu, Design of a Voice Digitizer Circuit for IBM PC, 1986
- O.A.Morean, Paradigms in the Collision Free Path Planning of a Computer Controlled Mobile Robot, 1984



#### **■** B.S. Honors Thesis Students

- Oluwabukola Akinbo, Visual Memory Assistant Portable Facial Recognizer, 2006
- S. Moscariello, *Java Image Processing*, 1997
- S.Oswald, *Hierarchical Segmentation of Video Sequences*, 1995
- M.Lebold, Speech Recognition System for Home Automation, 1995
- J.Bolch, Color Digital Image Processing on a Personal Computer, 1989
- P.Gyugyi, Automated Identification of Brain Tumors Using Magnetic Resonance Images, 1988
- W.R.Mandel, Slow Scan Television Frame Grabber, 1987
- N.T.Nguyen, Microprocessor Controlled Voice Synthesized Real Time Clock, 1987



#### Thank You

