


## Automating Tactile Graphics Translation


*Computer Vision*  
CSE 455  
2009

Richard Ladner  
University of Washington



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## Blind Scientists and Engineers




Kent Cullers, Ph.D.  
Physics



Cary Supalo  
Grad Student  
Chemistry



Geerat Vermeij, Ph.D.  
Evolutionary Biologist



2

## Blind Scientists and Engineers



Bill Gerrey  
Electrical Engineering  
Inventor



Imke Durre, Ph.D.  
Atmospheric Science




William Skawinski  
Professor, Chemistry




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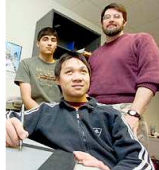
## Blind Scientists and Engineers




H. David Wohlers  
Professor, Chemistry



TV Raman  
Computer Science  
Google



Victor Wong  
EE Grad Student



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## Blind Scientists and Engineers



Chieko Asakawa  
Computer Scientist  
IBM



Hideji Nagaoka  
Computer Scientist  
Tsukuba U. of Tech




Katsuhito Yamaguchi  
Physics  
Nihon University



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UW  
Students



Zach Lattin  
Math Major

Sangyun Hahn  
Ph.D. Student  
CSE



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## The Problem

Let us use the procedure to solve the application presented at the beginning of this lesson.

**Given:** Let  $x$  = the number of acres of crop A,  
 and let  $y$  = the number of acres of crop B.

**Required:**  $x \geq 0, y \geq 0$   
 Average cost for the first 4000 lbs of crop A is \$1.10. The average cost for the next 4000 lbs is \$1.20. The average cost for the next 4000 lbs is \$1.30. The average cost for the next 4000 lbs is \$1.40.

**Graphical Solution:**

**Mathematical Solution:**

The vertices are at (0,0), (10,0), (10,10), (15,10), (15,20), and (0,20).  
 Profit function:  $P(x,y) = 1000x + 2000y$   
 Constraints:  
 $x + y \leq 20$   
 $x \leq 15$   
 $y \leq 10$

**Text Solution:**

The maximum profit is \$30,000, achieved at (15, 10).  
 The maximum profit is \$30,000, achieved at (15, 10).  
 The maximum profit is \$30,000, achieved at (15, 10).  
 The maximum profit is \$30,000, achieved at (15, 10).

**Text:** The maximum profit is \$30,000, achieved at (15, 10).  
 The maximum profit is \$30,000, achieved at (15, 10).  
 The maximum profit is \$30,000, achieved at (15, 10).  
 The maximum profit is \$30,000, achieved at (15, 10).

**Tactile graphics logo**

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## Outline

- Tactual Perception
- Text
- Math
- Graphics
- Problems
- Thanks
- Demo

**Tactile graphics logo**

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## Tactile Perception

- Resolution of human fingertip: 25 dpi
- Tactual field of perception is no bigger than the size of the fingertips of two hands
- Color information is replaced by texture information
- Visual bandwidth is 1,000,000 bits per second, tactile is 100 bits per second

**Tactile graphics logo**

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## Braille

- System to read text by feeling raised dots on paper (or on electronic displays). Invented in 1820s by Louis Braille, a French blind man.

**Critical fact:** Fixed height and width

a	⠁	b	⠃	c	⠉	z	⠵
and	⠁⠗⠗	the	⠞⠃⠑	with	⠠⠠⠠	mother	⠠⠠⠠⠠
th	⠞⠃	ch	⠉⠃	gh	⠠⠃		
Z	⠠⠵	3	⠠⠞	Mode characters:	cap and num.		

**Tactile graphics logo**

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## Tiger Embosser

- 20 dpi (raised dots per inch)
- 7 height levels (only 3 or 4 are distinguishable)
- Prints Braille text and graphics
- Prints dot patterns for texture
- Invented by a blind man, John Gardner

**Tactile graphics logo**

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## Outline

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**Tactile graphics logo**

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## Text

Let's use the procedure to solve the application presented at the beginning of the lesson.

**Given:** Let  $x =$  the number of units of camp A, and  $y =$  the number of units of camp B.

**Objective:** Maximize  $P(x, y) = 396x + 270y = 0$

**Constraints:**  $x \geq 0, y \geq 0$  (Always consider the first quadrant)  
 $x + y \leq 100$  (The number of units of camp A and B cannot exceed 100 units)  
 $2x + y \leq 200$  (The number of units of camp A and B cannot exceed 200 units)

**Graph:** The feasible region is shaded in the first quadrant. The vertices are at (0,0), (100,0), (15,15), and (0,20).

**Vertices:**  $P(0,0) = 396(0) + 270(0) = 0$   
 $P(100,0) = 396(100) + 270(0) = 39,600$   
 $P(15,15) = 396(15) + 270(15) = 7,290$   
 $P(0,20) = 396(0) + 270(20) = 5,400$

**Conclusion:** The maximum profit is \$7,290, achieved by producing 15 units of camp A and 15 units of camp B.

**Text Image:** The constraints do not define a region with any points in common in Quadrant I. When the constraints of a linear programming problem cannot be satisfied simultaneously, then **infeasibility** is said to occur. This may mean that the constraints have been formulated incorrectly, certain requirements need to be changed, or that additional resources are required before the problem can be solved.

**Braille:** The constraints do not define a region with any points in common in Quadrant I. When the constraints of a linear programming problem cannot be satisfied simultaneously, then infeasibility is said to occur. This may mean that the constraints have been formulated incorrectly, certain requirements need to be changed, or that additional resources are required before the problem can be solved.

**Speech:** The constraints do not define a region with any points in common in Quadrant I. When the constraints of a linear programming problem cannot be satisfied simultaneously, then infeasibility is said to occur. This may mean that the constraints have been formulated incorrectly, certain requirements need to be changed, or that additional resources are required before the problem can be solved.

**Tactile graphics:** A tactile graphic of the feasible region is provided, showing the vertices and the objective function line.

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## Text Translation

**Text Image**

**Text**

**Braille Translation (Duxbury)**

**Speech Synthesis (Jaws)**

**Braille**

**Speech**

**Tactile graphics:** A tactile graphic of the feasible region is provided, showing the vertices and the objective function line.

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## Outline

- Tactual Perception
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**Tactile graphics:** A tactile graphic of the feasible region is provided, showing the vertices and the objective function line.

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## Math

**Math:** The constraints do not define a region with any points in common in Quadrant I. When the constraints of a linear programming problem cannot be satisfied simultaneously, then infeasibility is said to occur. This may mean that the constraints have been formulated incorrectly, certain requirements need to be changed, or that additional resources are required before the problem can be solved.

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## Math Translation

**Math Image**

**Latex**

**Braille Translation (Duxbury)**

**Nemeth Code**

**Tactile graphics:** A tactile graphic of the feasible region is provided, showing the vertices and the objective function line.

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## Math Translation Examples

**Math:** The constraints do not define a region with any points in common in Quadrant I. When the constraints of a linear programming problem cannot be satisfied simultaneously, then infeasibility is said to occur. This may mean that the constraints have been formulated incorrectly, certain requirements need to be changed, or that additional resources are required before the problem can be solved.

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# Outline

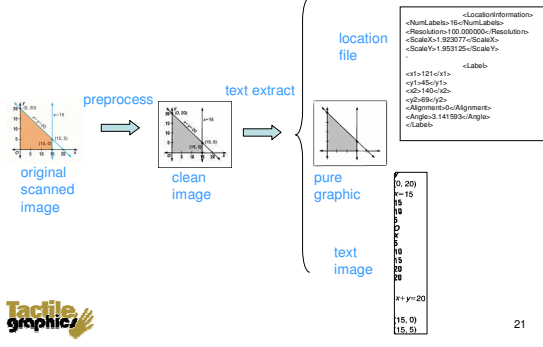
- Tactual Perception
- Text
- Math
- Graphics
- Problems
- Thanks
- Demo



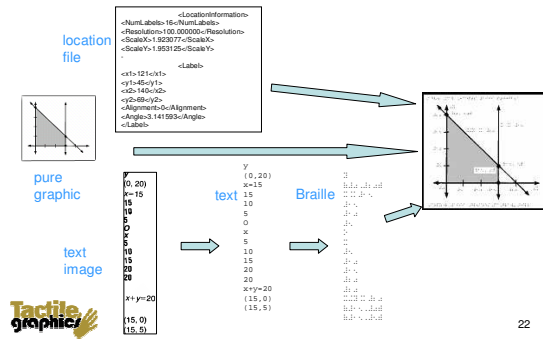
# Graphics



# Graphic Translation

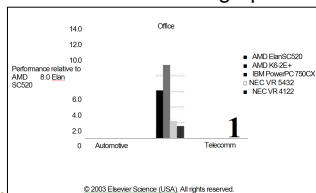


# Graphic Translation



# Finding Text

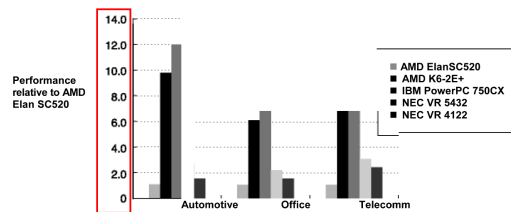
- Why not just use standard optical character recognition (OCR)?
  - OCR is not effective for graphical images.



ABBYY FineReader 7.0 Professional Edition



# More OCR



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## Find Text Letters

- Uses the following principles
  - Text in an image is usually in one font
  - Fonts are designed to have a uniform density at a distance.
  - In the absence of noise an individual letter tends to be connected component of one color. Exceptions are i and j.
- Use machine learning to determine which connected components are letters.

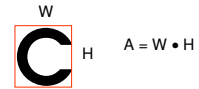


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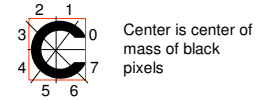
## Features

### Century Gothic

W = width of bounding box  
H = height of bounding box  
A = area of bounding box  
 $R_i$  = i-th radial slice density



$R_i$  = number of black pixels in i-th slice where a slice is an angle of  $360/n$ . The total number of slices is n.



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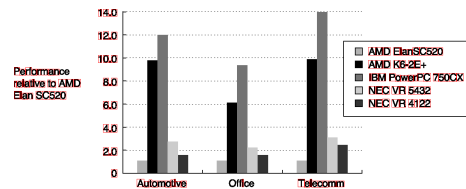
## Machine Learning

- Training:
  - Sample the connected components and compute their features.
  - Use these features to train a Support Vector Machine (SVM).
- Finding:
  - For a new connected component compute its features.
  - Feed these features into the SVM.



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## Example



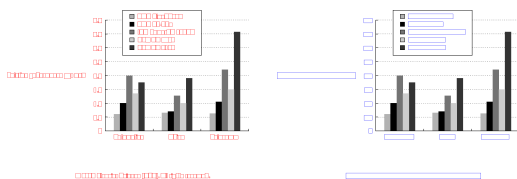
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Trained on a different images from the same book. About 200 letters in the training set.



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## Find Text Blocks



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## Group characters logically

- Extracting a set of isolated characters from an image is insufficient
  - Need groups of Braille characters for easier placement
- Challenges
  - Text can be at many angles
  - Individual characters may be aligned along multiple axes



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## Our approach

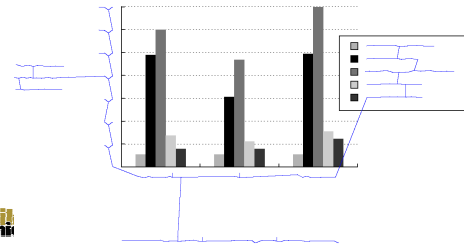
- Step 1: User provides training set
  - Software examines defining features
- Step 2: Automatically find similar groups in remaining images
  - A. Minimum spanning tree
  - B. Discard useless edges
  - C. Discard inconsistent edges
  - D. Create merged groups



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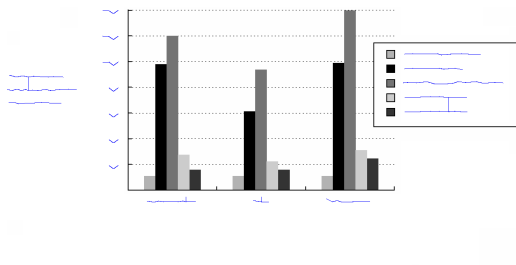
## Minimum spanning tree (1)

Treat the centroid of each connected component as a node



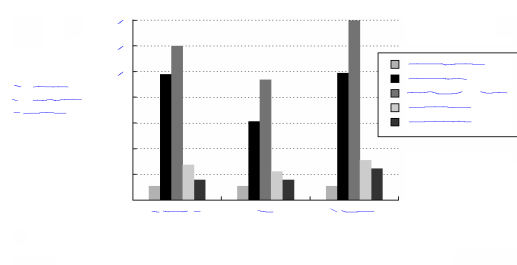
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## Discard useless edges (2)



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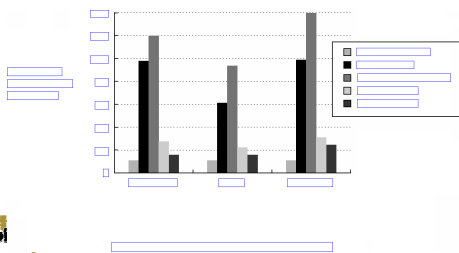
## Discard inconsistent edges (3)



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## Final merge step (4)

Merge only if the resultant group is consistent



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## OCR on Text Image

Image of text boxes

14.0  
12.0  
10.0  
8.0  
6.0  
4.0  
2.0  
0  
Performance relative to AMD Elan SC520 Automotive Office Telecomm  
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AMD ElanSC620  
AMD K6-2E+  
IBM PowerPC 750CX  
NEC VR 5432  
NEC VR 4122

Text

14.0  
12.0  
10.0  
8.0  
6.0  
4.0  
2.0  
0  
Performance relative to AMD Elan SC520  
© 2003 Elsevier Science (USA). All rights reserved.  
AMD ElanSC620  
AMD K6-2E+  
IBM PowerPC 750CX  
NEC VR 5432  
NEC VR 4122

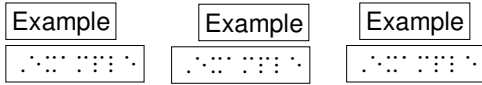
OCR →



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## Braille Placement

- Text boxes of Braille will be of different size than the original text boxes
  - Mode characters
  - Contractions
  - Braille is fixed width



Left justified

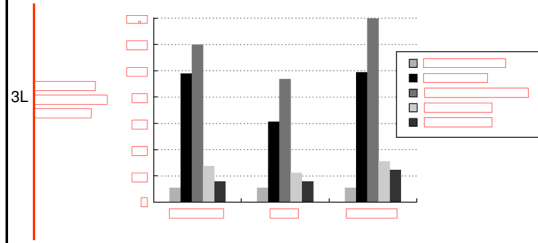
Right justified

Centered



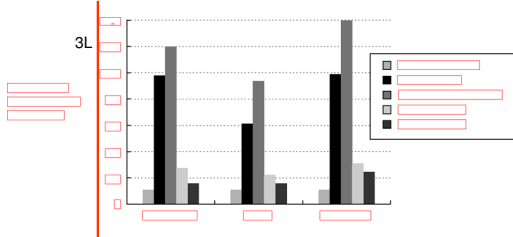
37

## Example Plane Sweep



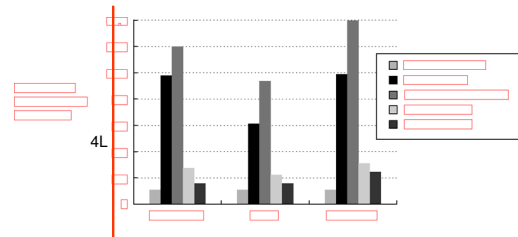
38

## Example Plane Sweep



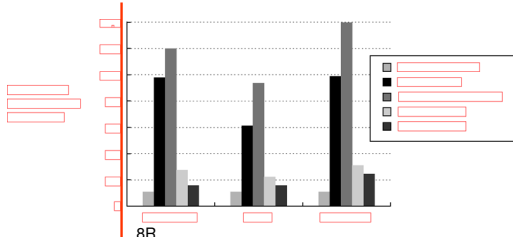
39

## Example Plane Sweep

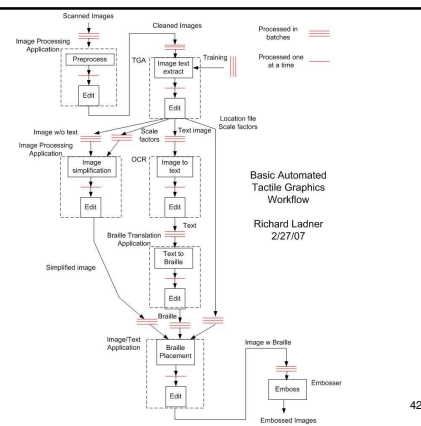


40

## Example Plane Sweep

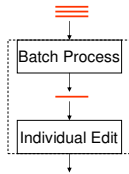


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## Subtask Pattern

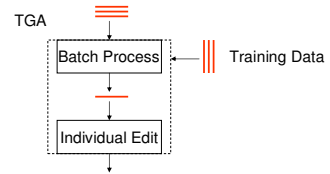


- TGA batch process
- Photoshop and Illustrator scripts
- Omnipage batch manager
- Duxbury command line



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## Tactile Graphics Assistant



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## Available Books

- [Computer Architecture: A Quantitative Approach, 3rd Edition](#)  
Hennessy and Patterson  
2002 Elsevier  
25 minutes per figure
- [Advanced Mathematical Concepts, Precalculus with Applications](#)  
Gordon-Holliday, et al.  
1999 Glencoe/McGraw-Hill  
6.3 minutes per figure
- [An Introduction to Modern Astrophysics](#)  
Carroll and Ostlie  
1996 Addison-Wesley  
10.2 minutes per figure
- [Discrete Mathematical Structures](#)  
Kolman, Busby and Ross  
2003 Prentice Hall  
8.8 minutes per figure



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## Time per Figure

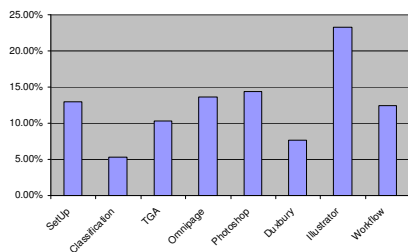
	Discrete Math	Precalculus	Astronomy	
	Min	Min	Min	Min
SetUp	425 10.3%	660 9.8%	1110 18.3%	
Classification	245 5.9%	390 5.8%	270 4.4%	
TGA	595 14.4%	570 8.4%	585 9.6%	
Omnipage	714 17.3%	660 9.8%	945 15.6%	
Photoshop	800 19.4%	975 14.4%	660 10.9%	
Duxbury	225 5.5%	630 9.3%	450 7.4%	
Illustrator	770 18.7%	1335 19.7%	1845 30.4%	
Workflow	350 8.5%	1545 22.8%	210 3.5%	
Total	4124 100.0%	6765 100.0%	6075 100.0%	
	num figs 467	num figs 1080	num figs 598	
	min/fig 8.8	min/fig 6.3	min/fig 10.2	

Ave 7.9 min/figure



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## Work Balance



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## TGA Workflow

- Advantages
  - Much faster production
  - Batch processing instead of one figure at a time
  - Much tedious work is avoided
- Disadvantages
  - May be of lower quality than custom translation
  - A lot of technology needs to be mastered



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## One-offs vs. Mass Production



1916 Woods  
Dual Power



1906 Reo



From the Collections of Henry Ford  
Museum & Greenfield Village

Model T



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## Outline

- Text
- Math
- Graphics
- Workflow
- Problems
- Thanks
- Demo



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## Problem solving

- Each book present a set of unique problems.
- We consider a few today
  - Classification of figures
  - Legends and colors
  - Text at an angle
  - Math in figures
  - Grids

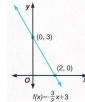


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## Classes



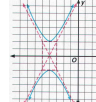
Clean area  
83



Clean lines  
648



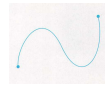
Complex  
62



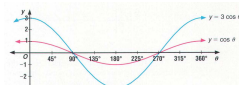
Grid clean  
15



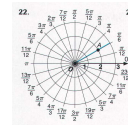
Grid overlap  
113



No text  
41



Overlapped text  
94



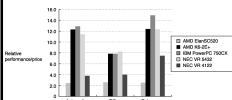
Radial  
53



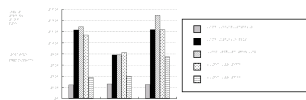
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## Legends and Colors

- Legends may have to be enlarged.
- Colors may have to be replaced with textures.



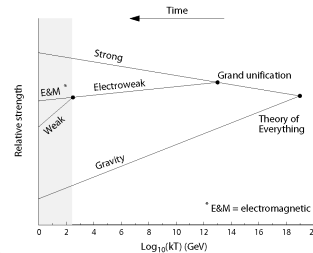
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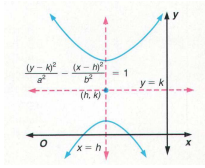
## Angled Text

- Braille should be printed horizontally.



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## Math – Infty Reader



$$\frac{(y-k)^2}{a^2} - \frac{(x-h)^2}{b^2} = 1$$

$y = k$   
 $y$   
 $x$   
 $(h, k)$   
 $O$   
 $x = h$

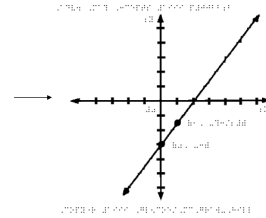
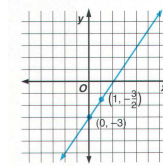
Extracted Math Image



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## Grids

- Grids may not work well in tactile form.



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## TGA Technology

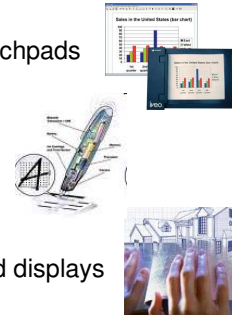
- Tactile Graphic Assistant
  - C++
  - Machine Learning (Support Vector Machine)
    - Learns features of text from positive and negative examples.
  - Computational Geometry
    - Text justification
  - Free executable
  - Licensable source code



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## Technologies in the Future

- Include Audio with Touchpads
- Digital Pen and Paper
- Electro-rheological fluid displays



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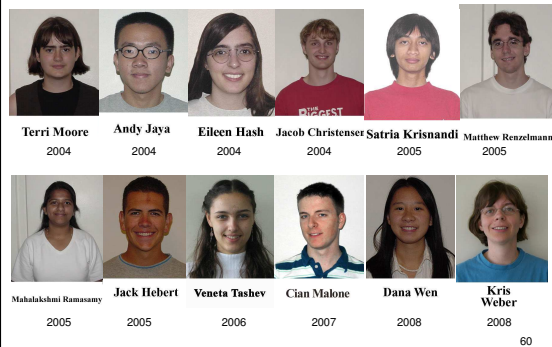
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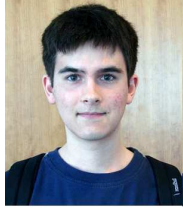
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## CSE Undergraduate Students



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## Current Undergraduate Student



Josh Scotland



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## CSE Graduate Students



Sahngyun Hahn

Chandrika Jayant



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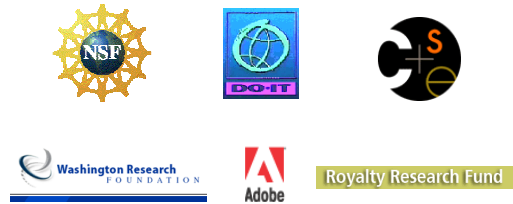
## Thanks To

- Dan Comden
- Sheryl Burgstahler
- Raj Rao
- Melody Ivory
- Ethan Katz-Basset
- Zach Lattin
- Stuart Olsen
- Many others



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## Thanks To



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## DEMO



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