

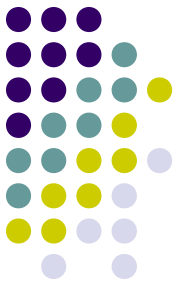
Designing an Interactive System for the Disabled Users

Samit Bhattacharya

Research Scholar

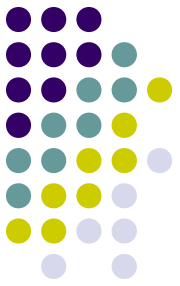
Dept. of Computer Science & Engineering

IIT Kharagpur



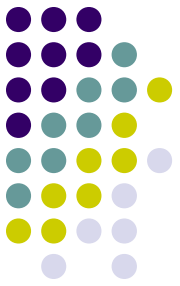
Assistive Technology (AT)

- ❑ Technology to assist individuals with disabilities to carry out various activities
- ❑ Who needs such technology
 - Visually impaired
 - Hearing impaired
 - Speech and motor impaired
 - Mentally retarded



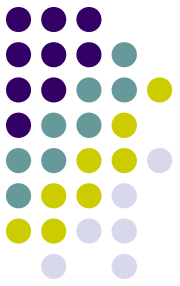
How AT can help?

- ☐ Education
- ☐ Interpersonal communication
- ☐ Daily activities
- ☐ Entertainment
- ☐ Creativity
- ☐ Knowledge acquisition



HCI challenge

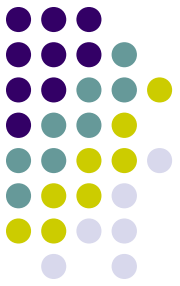
- ❑ Traditional I/O techniques may not be suitable
 - Sensory/motor requirements may not be present in the disabled user
- ❑ New interaction methods and techniques are required



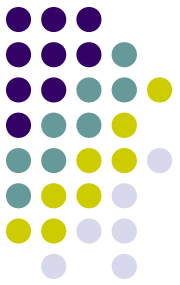
Examples

- ❑ Text to speech synthesis-screen reader
- ❑ Speech recognition
- ❑ Braille printer
- ❑ Haptic and Tactile devices for input/output
- ❑ Voice output communication aids

AAC: Augmentative and Alternative Communication

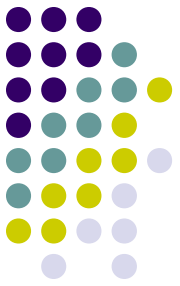


- ❑ Communication aids for the speech and motor impaired
 - Cerebral Palsy
 - Muscular Dystrophy
 - Friedrich's Ataxia
 - Quadriplegia
- ❑ Alternate input methods
 - Alternate method of direct input (eye tracker, head tracker, head pointing)
 - Scanning or sequential input



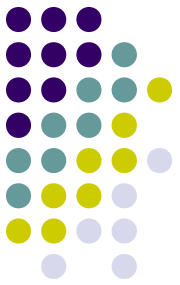
AAC systems

- ❑ Icon based
- ❑ Text based
 - Character level text composition
 - ❖ 0.5-5 wpm
 - Word level
 - ❖ Compansion (10-15 wpm)
 - Storage and recall of pharses, sentences, paragraphs)
 - Conversational modeling (storage of scripts, schemata, frames)
 - ❖ >60 wpm



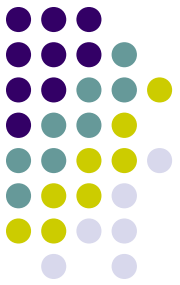
Character level systems

- ❑ Characterized by
 - Slow entry rate
 - Tedious
- ❑ But required for natural communication
 - Creation of novel and spontaneous statements during conversation
 - Off-line writing tasks, i.e. essays, stories, letters and messages



Soft or on-screen keyboards

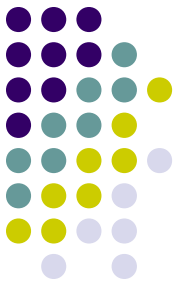
- ❑ Keys are arranged in rows and columns
- ❑ Operated by
 - eye tracking
 - scanning input methods
- ❑ Text entry rate
 - 0.5-5 wpm
 - 6-8 wpm with rate enhancement techniques (prediction, ambiguity, abbreviation expansion)



Gesture driven systems

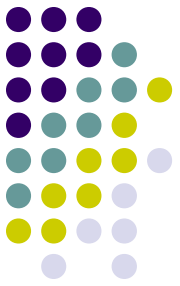
- Continuous gesture used for text composition
 - Trackball EdgeWrite: 6-8 wpm
 - Dasher: 25 wpm (with eye tracker)

Our Focus- Scanning Keyboards



- ❑ Soft keyboards operated with scanning input methods

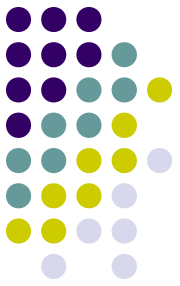
Our Focus- Scanning Keyboards



- ❑ Soft keyboards operated with scanning input methods

Q	W	E	R	T	Y	U	I	O	P
A	S	D	F	G	H	J	K	L	Enter
Z	X	C	V	B	N	M	—	<--	Shift

Our Focus- Scanning Keyboards

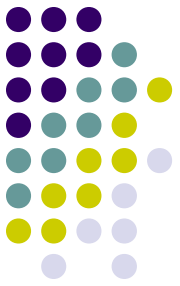


- ❑ Soft keyboards operated with scanning input methods

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Our Focus-

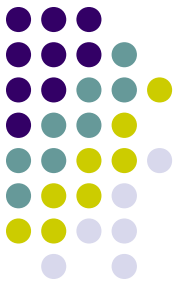
Scanning Keyboards



- ❑ Soft keyboards operated with scanning input methods

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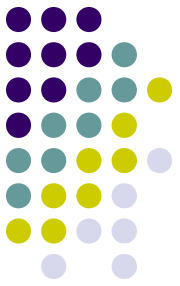
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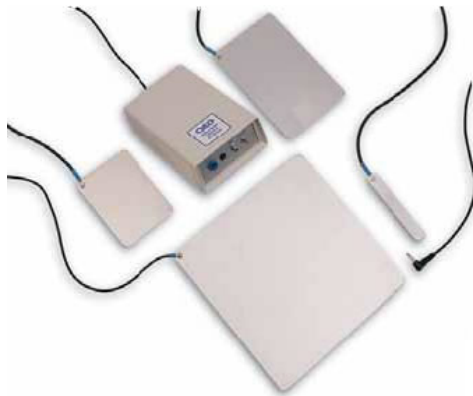
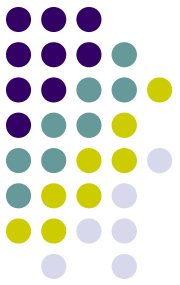
Our Focus- Scanning Keyboards

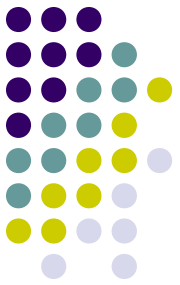


- ❑ Soft keyboards operated with scanning input methods

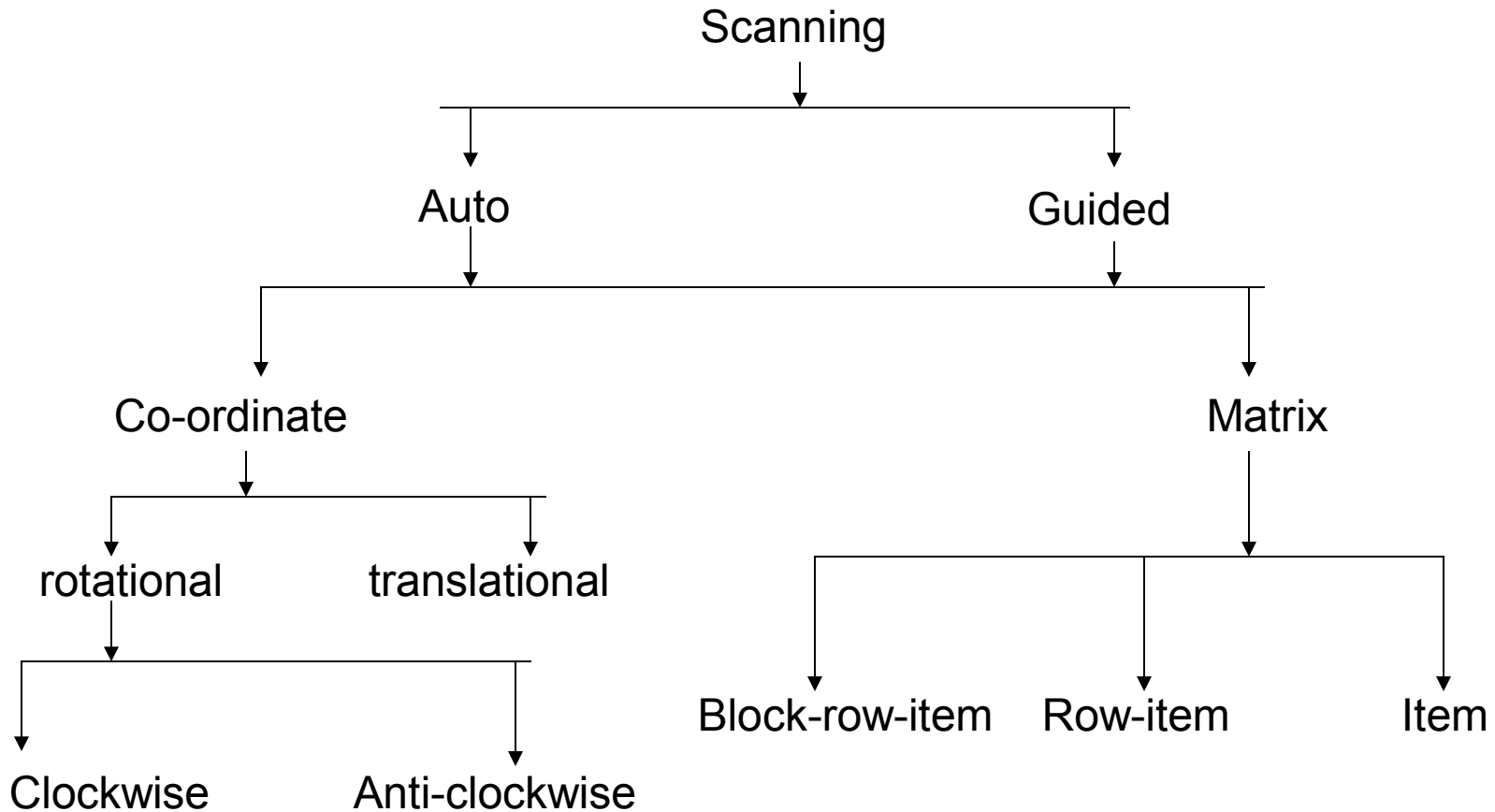
Q	W	E	R	T	Y	U	I	O	P
A	S	D	F	G	H	J	K	L	Enter
Z	X	C	V	B	N	M	—	<--	Shift

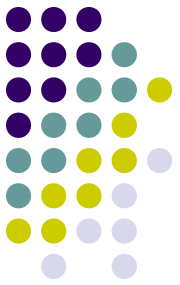
Input Devices



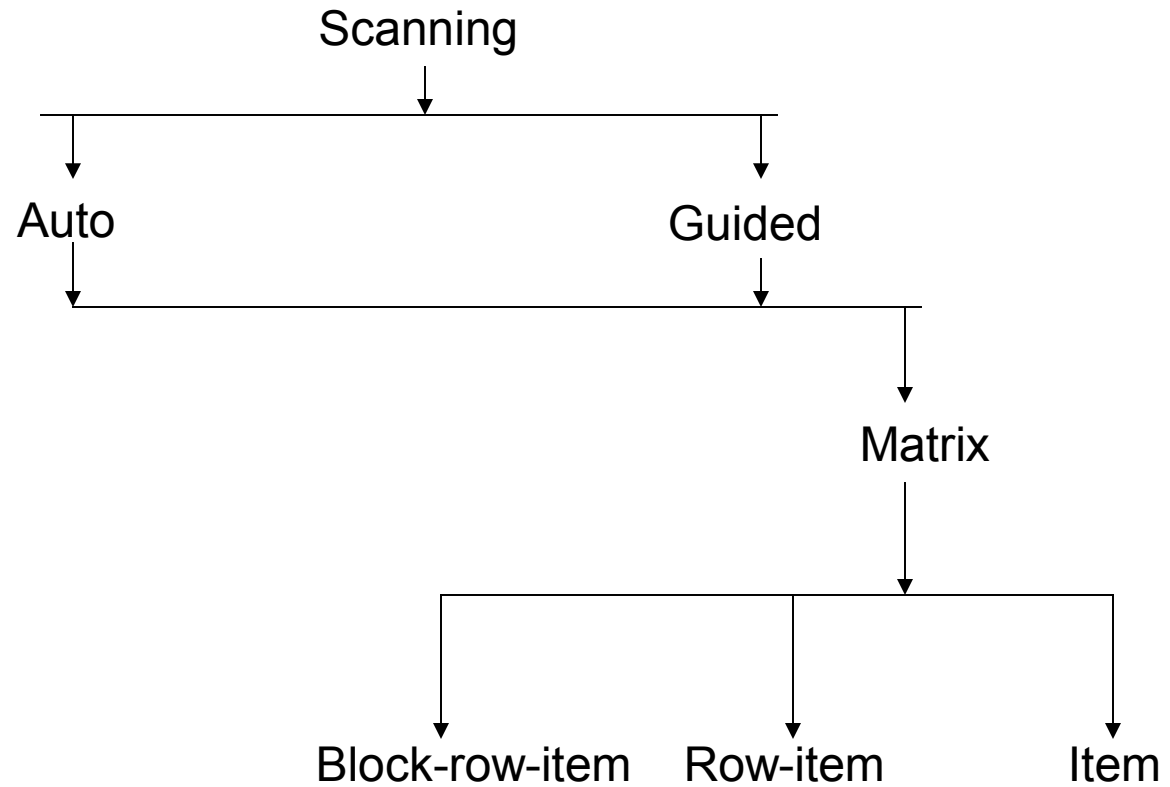


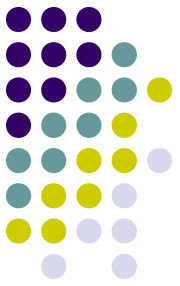
Scanning types





Scanning types

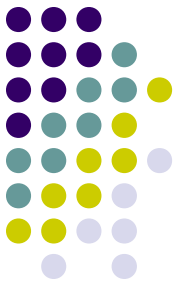




Design Challenge

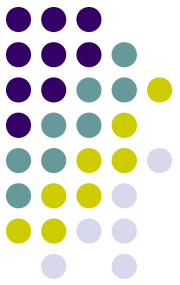
- ❑ Large design space
 - With 27 keys, 27! Possible layouts
 - Each can be operated with either of the scanning methods

- ❑ How to choose a design that optimizes user performance?



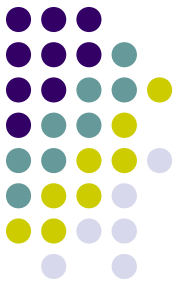
Standard Design Method

- ❑ Reduce size of the design space based on experience and intuition
- ❑ Implement prototypes of the remaining designs
- ❑ Test prototypes with disabled users to determine the best



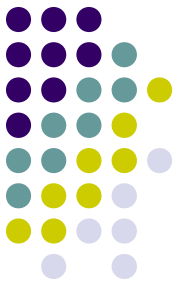
Problems

- ❑ Difficult to get disabled users for testing prototypes
 - Social pressure
 - Lack of exposure to computers
- ❑ Difficult to collect data large enough for analysis
 - Testing is physically demanding
 - Disabled users can not continue for long at a stretch
 - Data collection is slow



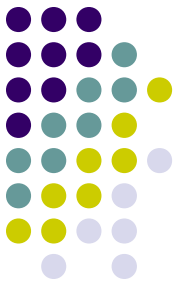
Model Based Design

- ❑ Evaluation of designs with user/performance models
 - Fast
 - Can be automated
 - Does not require user testing
 - Design space can be searched using the models
 - ❖ Removes dependency on designer's expertise to reduce design space



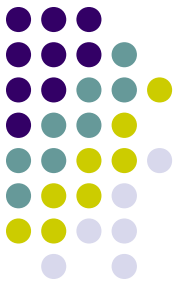
Performance Models

- ❑ The RG model by Rosen and Goodenough-Trepagnier (1981)
- ❑ Based on three components
 - L -- average no of language units per word
 - A -- average no of motor acts required to input each language unit
 - T – average time required to carry out each motor act
- ❑ $T_w = \text{average time to compose an word} = L * A * T$



Performance Models contd...

- ❑ Levine and Goodenough-Trepagnier (1990)
- ❑ Three performance models based on the RG model
 - Unambiguous keyboards
 - Soft keyboard with character encoding
 - Ambiguous keyboards



Performance Models contd...

- ❑ RG model considered only direct input, not scanning
- ❑ Damper (1984) extended the RG model for scanning keyboards
- ❑ According to Damper

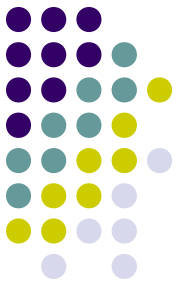
$$T_W = \frac{L}{R} \sum_{i=1}^K p_i(s_i + 1)$$

L = as before

R = scan rate

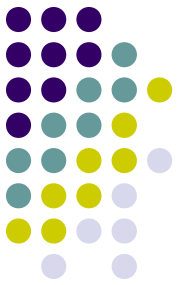
P_i = unigram char probability

S_i = no of scan steps from a home position



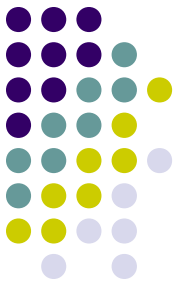
Performance Models contd...

- ❑ GOMS model by Horstmann and Levine (1990)
- ❑ KLM model by Koester and Levine (1994, 1997, 1998)
- ❑ Only interactions with direct input methods were modeled



Performance Models contd...

- ❑ The FD Model – Model for able-bodied users of soft keyboards (MacKenzie & Soukoreff, 1995; Soukoreff & MacKenzie, 2002; Zhai et al. 2002)
- ❑ Three components
 - Visual search time -- Hick-Hyman law
 - Movement time -- Fitts' law
 - Digraph probability -- from corpus



Performance Models contd...

- Movement time

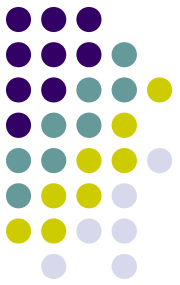
$$MT_{ij} = a + b \log_2(d_{ij} / w_j + 1)$$

- Visual search time

$$RT = a' + b' \log_2 N$$

- Digraph probability

$$P_{ij} = f_{ij} / \sum_{i=1}^N \sum_{j=1}^N f_{ij}$$



Performance Models contd...

- Average movement time

$$MT_{MEAN} = \sum_{i=1}^N \sum_{j=1}^N MT_{ij} \times P_{ij}$$

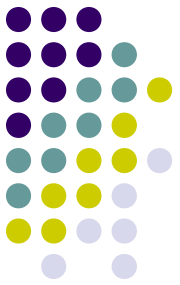
- Performance (CPS)

$$Novice = 1 / (RT + MT_{MEAN})$$

$$Expert = 1 / MT_{MEAN}$$

- Performance (WPM)

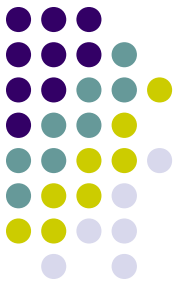
$$WPM = CPS \times (60 / W_{AVG})$$



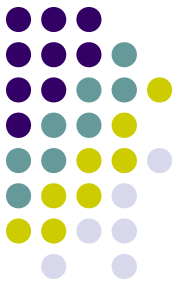
Comparison

- ❑ KLM/GOMS models require task description—
inputting a string of characters
 - Tedious
 - Desirable that the models do not take task description as input--RG and FD model are more suitable
- ❑ Damper's extended RG model
 - Considers only a particular scanning type
- ❑ FD model, appropriately modified, could alleviate these problems

Automatic Design Space Search



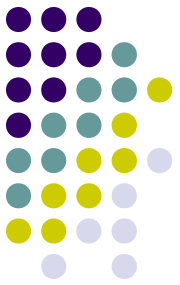
- ❑ Getschow et al. (1986) – greedy algorithm
 - Not very efficient
- ❑ Adaptive evolutionary search – Levine & Goodenough-Trepagnier (1990)
 - RG model for selection from a generation
- ❑ Dynamic Simulation, Metropolis algorithm (Zhai et al. 2002), Genetic algorithm (Raynal & Vigouroux, 2005)
 - FD model for selection



FD Model-Limitations

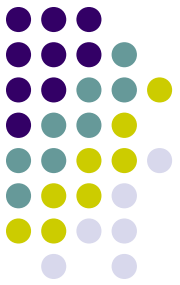
- ❑ Highlighter movement time instead of manual movement
- ❑ Switch input
- ❑ User errors

- ❑ We have addressed these issues in our work



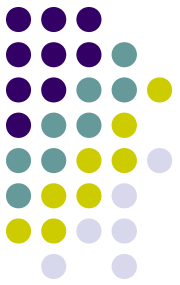
Modeling Scanning Interaction

- ❑ Replace Fitts' law with focus movement and selection time (FT)
- ❑ Assumptions
 - Each key holds single character
 - No prediction
 - Focus returns to the current block/row/item after each selection
 - No errors
- ❑ Let there are two keys: $K=\langle b,r,c\rangle$, $k'=\langle b',r',c'\rangle$
- ❑ Events between selection of k' after k



Auto Scanning Events

Event	Notation	Time
b is highlighted again	FOC()	System dependent
Focus moves from b to b'	MOV(b, b')	$[B+(b'-b)]T: b' < b$ $(b'-b)T: b' \leq b$
User activates switch to select b'	SEL(b')	$T/2$
Row level scanning in b' starts	FOC()	System dependent
Focus moves from the first row to r'	MOV($r1, r'$)	$(r'-1)T$
User activates switch to select r'	SEL(r')	$T/2$
Item level scanning in r' starts	FOC()	System dependent
Focus moves from the first item to c'	MOV($c1, c'$)	$(c'-1)T$
User selects c' once c' is focused	SEL(c')	$T/2$

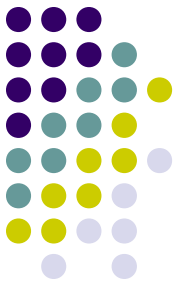


FT for Auto Scanning

- Sum of the individual event times

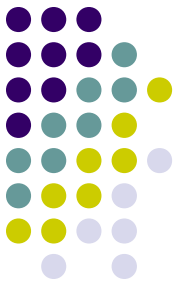
$$FT(k,k') = T_{so} + (X + C) \times T$$

T_{so}	Total time for three FOC() events
X	$(b' + r' + c') - b$
C	$-0.5 \quad b' \geq b;$ $(B - 0.5) \quad b' < b;$



Guided Scanning Events

Event	Notation	Time
b is highlighted again	FOC()	System dependent
User shifts focus from b to b'	SFT(b, b')	$[B+(b'-b)][T_{GS} + \text{FOC}()]:$ $b' < b$ $(b'-b) [T_{GS} + \text{FOC}()]:$ $b' \leq b$
User activates switch to select b'	SEL(b')	T_{GS}
Row level scanning in b' starts	FOC()	System dependent
User shifts focus from the first row to r'	SFT($r1, r'$)	$(r'-1) [T_{GS} + \text{FOC}()]$
User activates switch to select r'	SEL(r')	T_{GS}
Item level scanning in r' starts	FOC()	System dependent
User shifts focus from the first item to c'	SFT($c1, c'$)	$(c'-1) [T_{GS} + \text{FOC}()]$
User selects c' once c' is focused	SEL(c')	T_{GS}

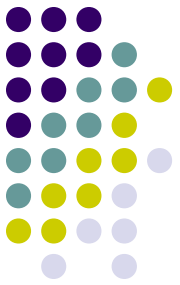


FT for Guided Scanning

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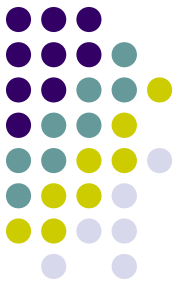
$$FT(k,k') = (X + C) \times (T_{GS} + FOC())$$

X	$(b' + r' + c') - b$
C	$\begin{array}{ll} 1 & b' \geq b; \\ (B+1) & b' < b; \end{array}$



Calculation of T_{GS}

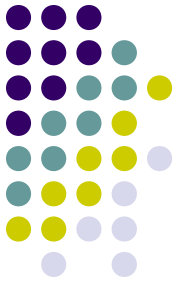
- ❑ Keates et al. (2000) proposed five steps for switch activation
 - Perceive focusing (perception) (100 ms, Card et al., 1983)
 - Decide to activate switch (cognition) (84 ms, Keates et al., 2000)
 - Activate switch (motor act) (105 ms, Keates et al., 2000)
 - Decide to deactivate switch (cognition) (84 ms, Keates et al., 2000)
 - Deactivate switch (motor act) (105 ms, Keates et al., 2000)
- ❑ $T_{GS} = 100 + 2(105 + 84) = 478 \text{ ms}$



User Study

- ❑ Eight interfaces
- ❑ Two layouts
- ❑ Four types of scanning on each layout
 - 3-level auto and guided scanning
 - 2-level auto and guided scanning
- ❑ Eight subjects
 - Six with disabilities
 - Two without disabilities

Interfaces



অ	আ	ই	ঈ	উ	ঊ	●
ঋ	এ	ঐ	ও	ঔ	×	
ক	চ	ট	ত	প	●	
খ	ছ	ঠ	ধ	ফ	×	
গ	জ	ড	দ	ব	×	
ঘ	ঝ	ঢ	ধ	ভ	×	
ঙ	ঞ	ণ	ন	ম	×	
শ	ষ	স	হ	×		
য	র	ল	লৃ	ডৃ	×	
য়	ৎ	ং	ঃ	ঁ	×	
।	ি	ী	ু	ূ	্	●
ে	ৈ	ো	ৌ	্য	্	×
১	২	৩	৪	৫	●	
৬	৭	৮	৯	০	×	
,		'	‘	?	!	●
space	bksp	jkAsr	ent	×		

আপনার ক্রমা:

clear ↑ ↓ ● ●

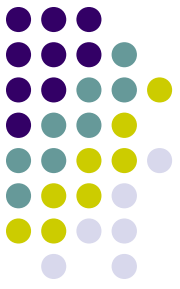
I1,I3,I5,I7

I2,I4,I6,I8

অ	আ	ই	ঈ	উ	ঊ	●
ঋ	এ	ঐ	ও	ঔ	×	
ক	খ	গ	ঘ	ঙ	●	
চ	ছ	জ	ঝ	ঞ	×	
ট	ঠ	ড	ঢ	ণ	×	
ত	থ	দ	ধ	ন	×	
প	ফ	ব	ভ	ম	×	
শ	ষ	স	হ	×		
য	র	ল	লৃ	ডৃ	×	
য়	ৎ	ং	ঃ	ঁ	×	
।	ি	ী	ু	ূ	্	●
ে	ৈ	ো	ৌ	্য	্	×
১	২	৩	৪	৫	●	
৬	৭	৮	৯	০	×	
,		'	‘	?	!	●
space	bksp	jkAsr	ent	×		

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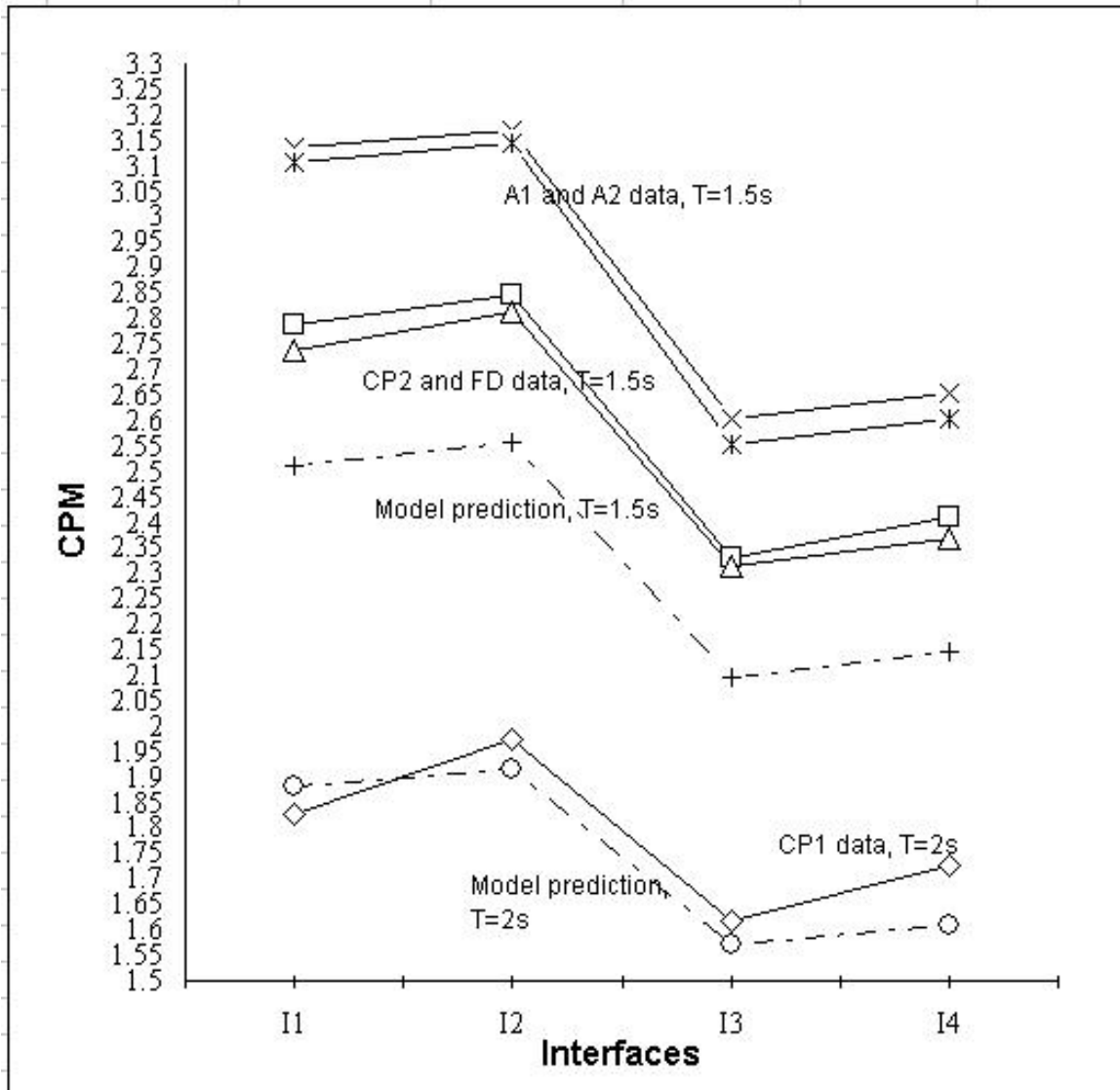
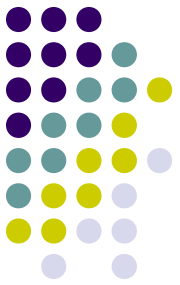
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Resources

- ❑ Digraph prob. table for Bengali (size = 104×104 including non-alphabetic pairs like “Enter-Space”)
- ❑ Average word length in Bengali (6 chars including space)
- ❑ Text *chunk* for data collection (630 chars)
- ❑ All the above from “Anandabazar” corpus
 - 96,012,779 characters

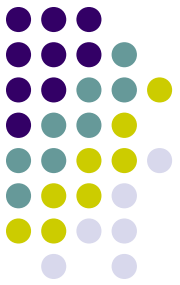
Results (Auto scanning)



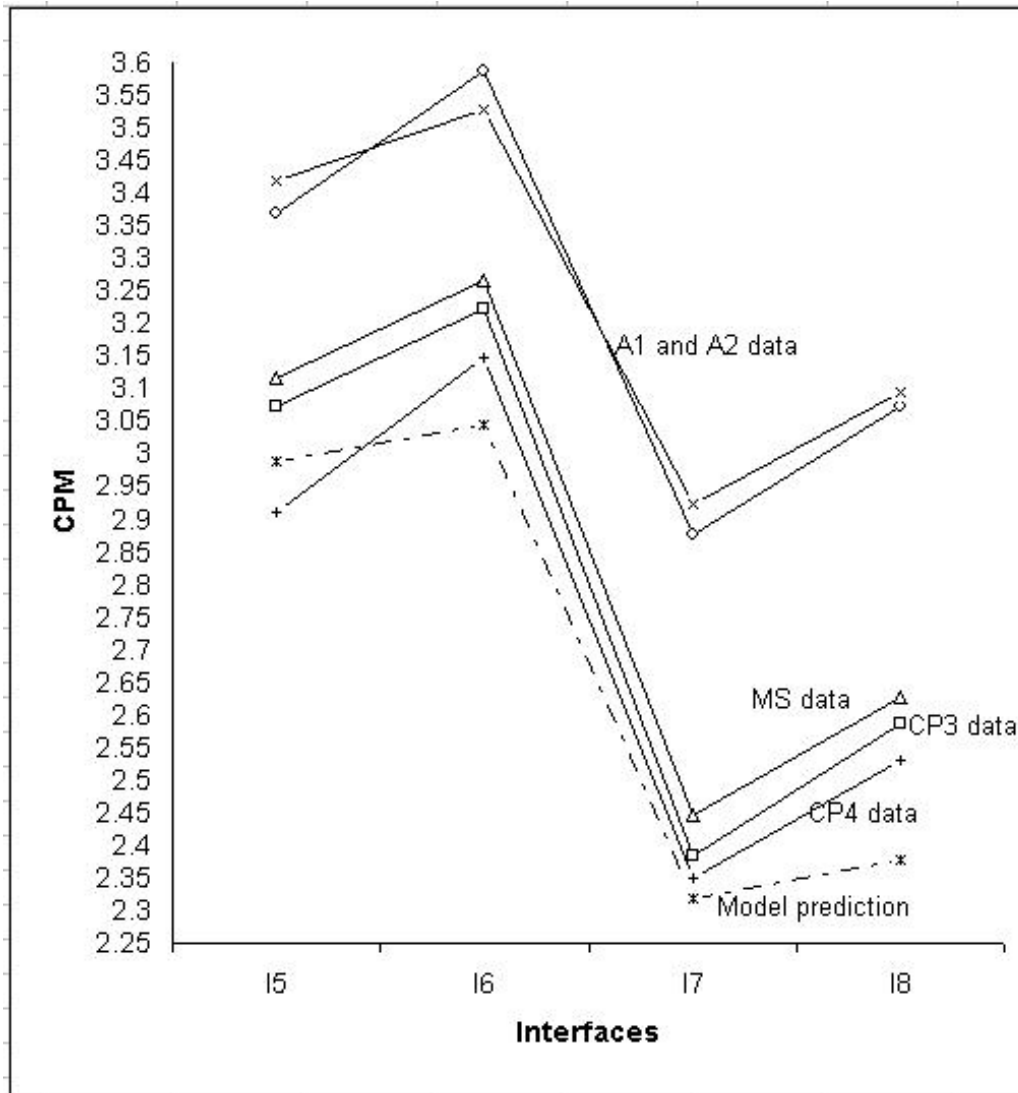
$$T_{so} = 3 * T \text{ for I1, I3}$$

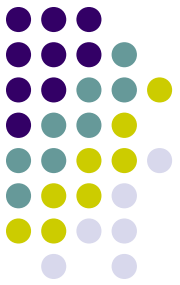
$$= 2 * T \text{ for I2, I4}$$

Results (Guided scanning)



$T_{GS} = 478 \text{ ms}$

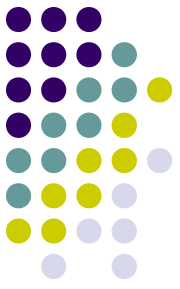




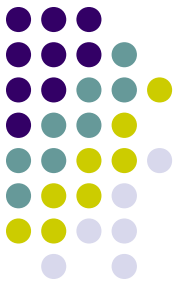
Discussion

- ❑ Difference between model and observations
 - Auto scanning - 5-10%
 - Guided scanning – 2-8%
- ❑ Reason??
 - $SEL() = T/2$
 - $T_{GS} = 478 \text{ ms}$
 - Five step switch activation model
 - Visual search

Error Study and Modeling: Background



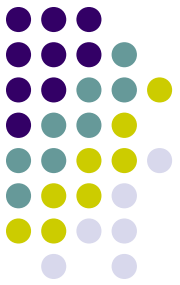
- ❑ Trewin and Pine (1998)
 - Direct input methods
- ❑ Performance models do not take into account the effect of errors
- ❑ Reason: lack of data
- ❑ Result: limited practical usefulness of resulting designs



User Study

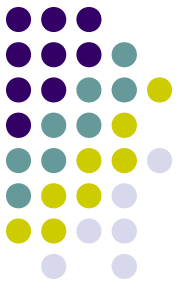
- ❑ Two layouts
 - Alphabetic organization
 - Single character each keys
 - No prediction
- ❑ 3-level, 2-level and 1-level auto scanning on each
- ❑ Six subjects with disabilities
- ❑ Printed texts of about 1000 characters for entry

Layouts



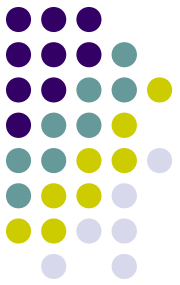
A	B	C
D	E	F
G	H	I
J	K	L
M	N	O
P	Q	R
S	T	U
V	W	X
Y	Z	BkSpC

অ	আ	ই	ঈ	উ	ঊ
ঋ	এ	ঐ	ও	ঔ	
ক	খ	গ	ঘ	ঙ	
চ	ছ	জ	ঝ	ঞ	
ট	ঠ	ড	ঢ	ণ	
ত	থ	দ	ধ	ন	
প	ফ	ব	ভ	ম	
শ	ষ	স	হ		
য	র	ল	ৗ	৚	
য়	৑	৒	৓	৔	
†	ি	ী	ু	ূ	ৎ
ে	ৈ	ো	ৌ	ক	ৎ
১	২	৩	৪	৫	
৬	৭	৮	৯	০	
,		'	'	?	!
space	bksp	jkAsr	ent		



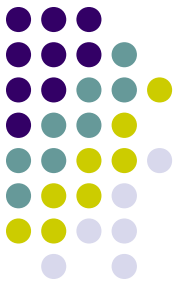
Experimental Method

- ❑ Two groups of experiments
- ❑ First group (English layout with three scanning types)
 - for data collection and model development
- ❑ Second group (Bengali layout with three scanning types)
 - validating results of first group



Observation

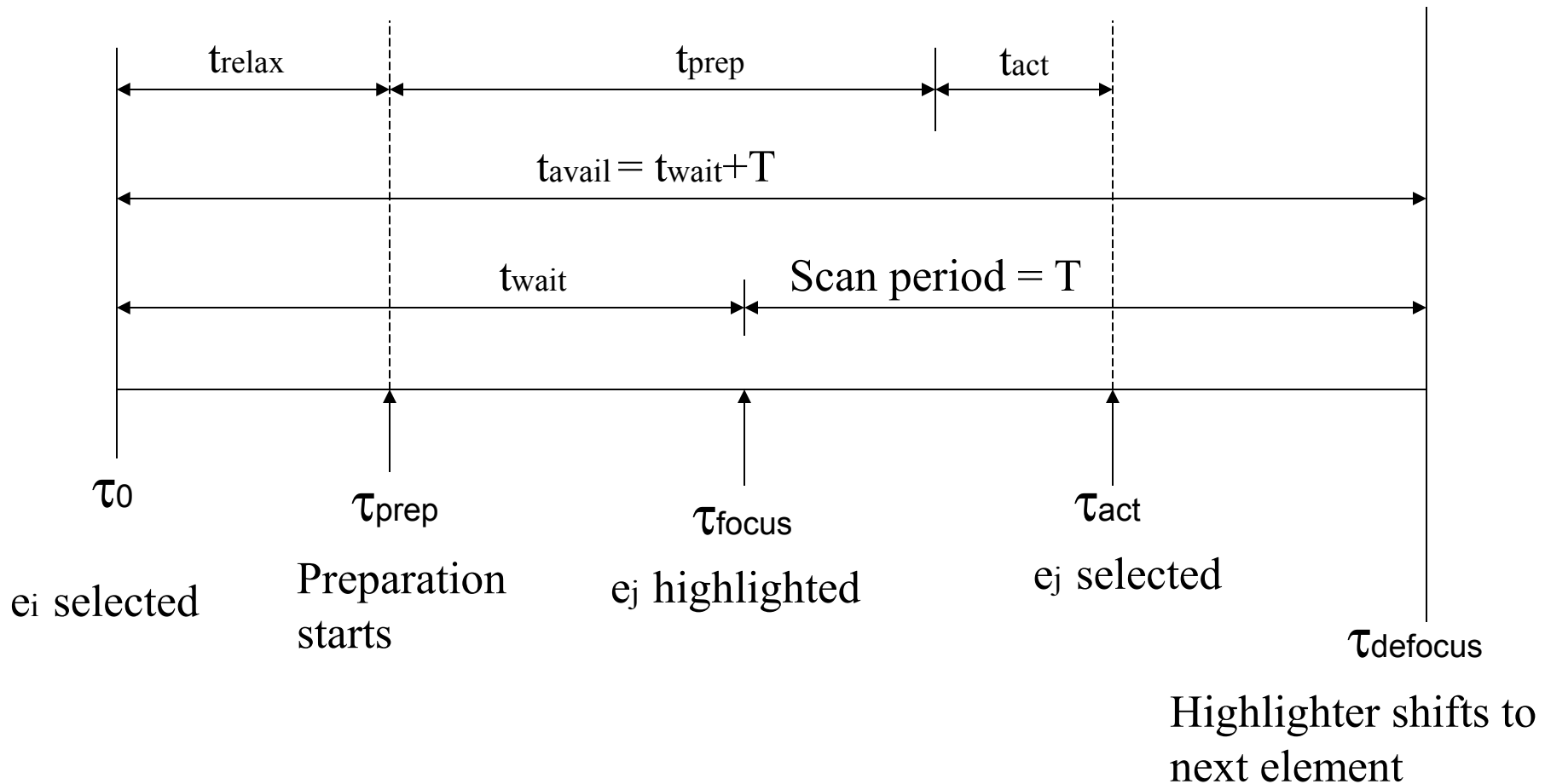
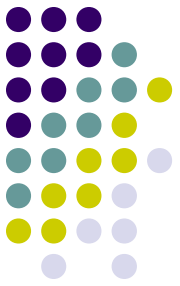
- ❑ Three types of errors
 - Timing errors (TE)
 - Selection errors (SE)
 - Transcription errors
- ❑ Transcription errors very rare and its effect can be ignored

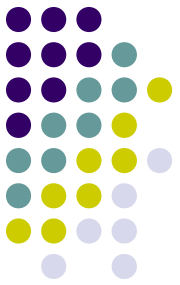


Effect of TE and SE

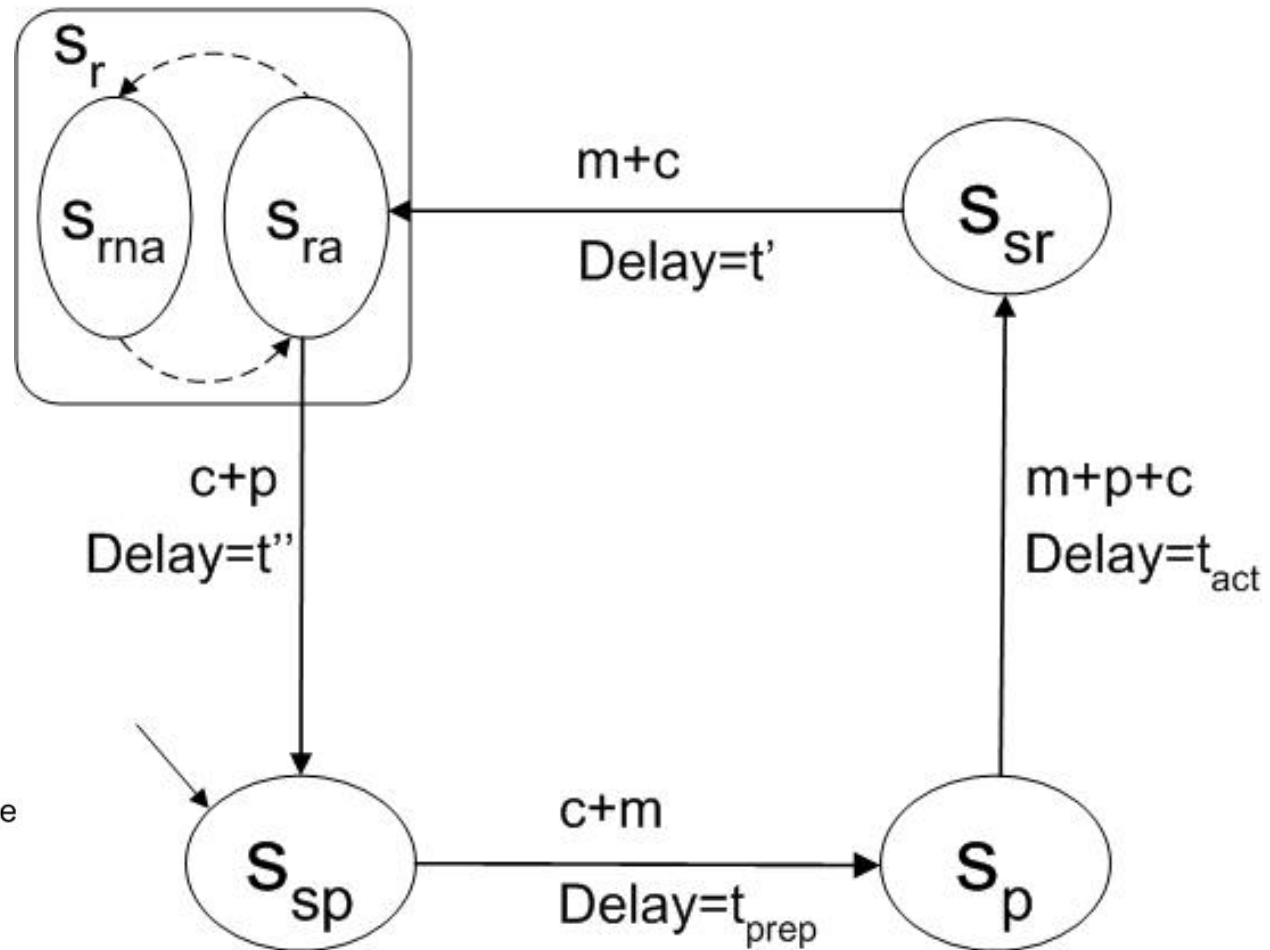
- ❑ Analyzed usage logs of the six subjects
- ❑ Increase in text entry time due to TE
 - 65% (approx) for 3-level
 - 45% (approx) for 2-level
 - 35% (approx) for 1-level
- ❑ Increase in text entry time due to SE
 - 35% (approx) for 3-level
 - 25% (approx) for 2-level
 - 15% (approx) for 1-level

Temporal Model of User Behavior

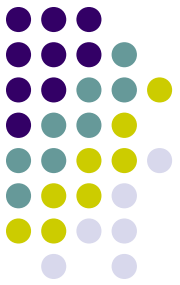




Finite State Model

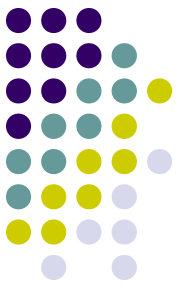


S_{sp} = Start preparation state
 S_p = Prepared state
 S_{sr} = Start relaxing state
 S_r = Relaxed state
 S_{ra} = Relaxed and attentive state
 S_{rna} = Relaxed but not attentive state

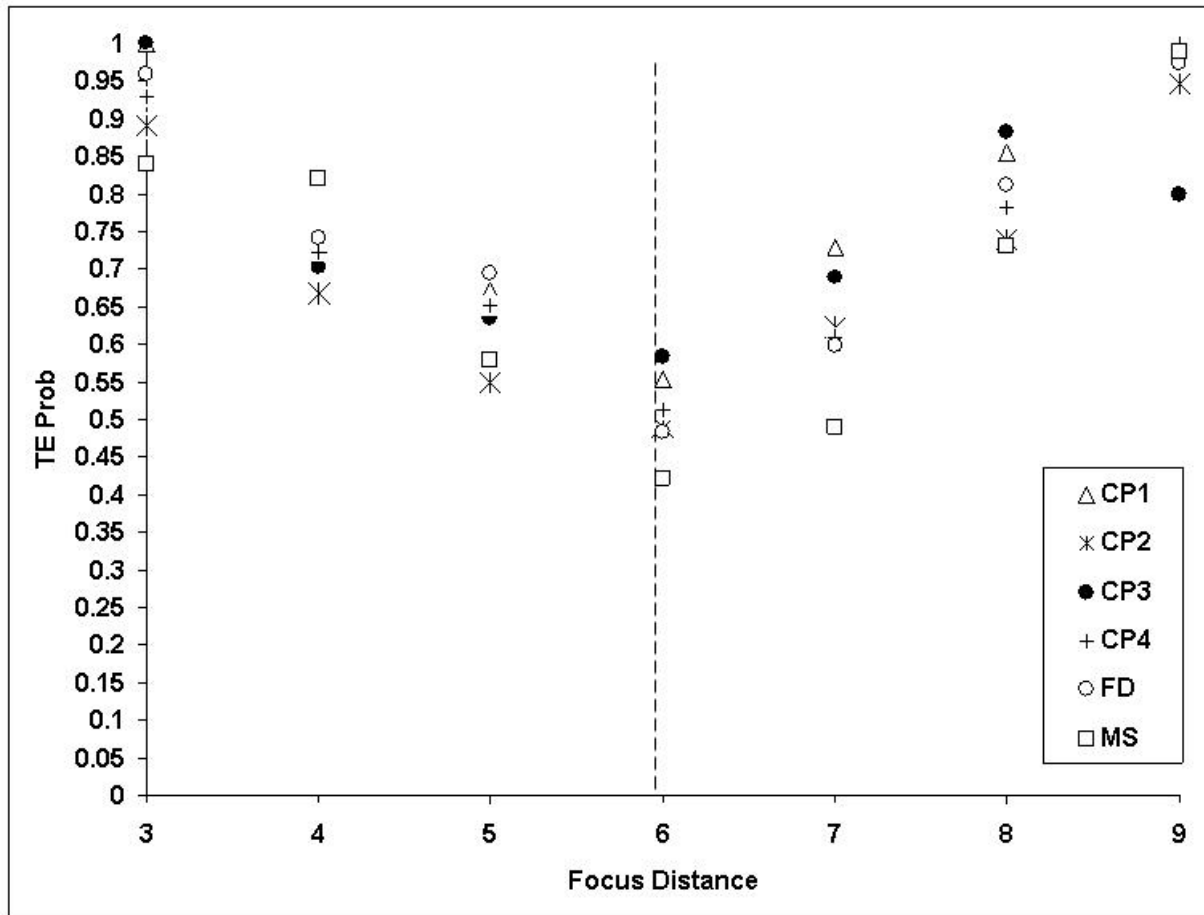


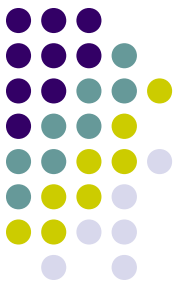
Model Prediction

- ❑ Focus distance between two elements
 - Number of highlighter shifts + switch activations
- ❑ Each scanning keyboard has
 - A minimum focus distance, $f_{\min}$
 - A maximum focus distance, $f_{\max}$
- ❑ User model predicts that
 - At $f_{\min}$, high TE probability
 - TE prob. decreases till a critical focus distance, f_c
 - Then, it increases again till $f_{\max}$
- ❑ No such pattern for SE, random in nature

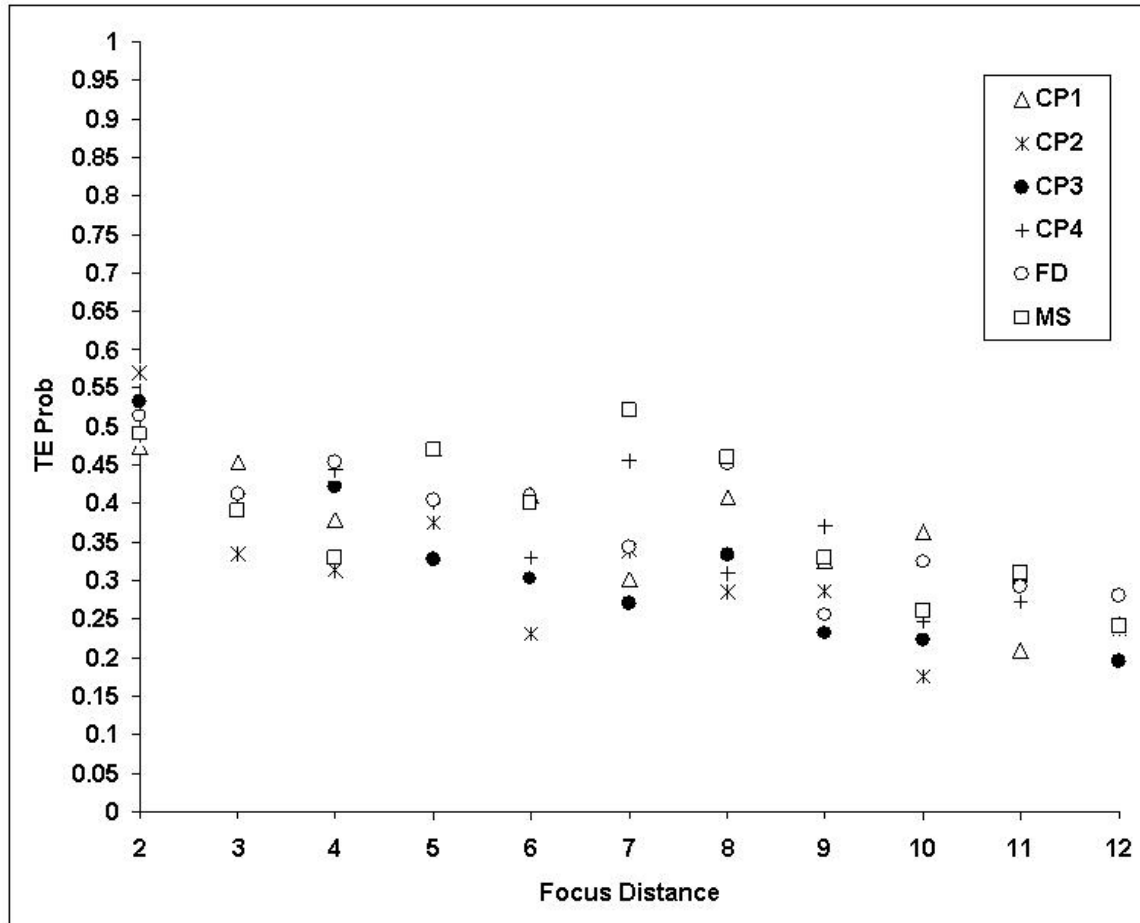


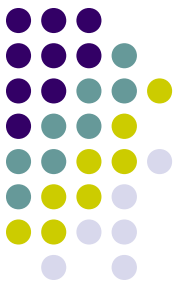
Observation: 3-level TE Dist.



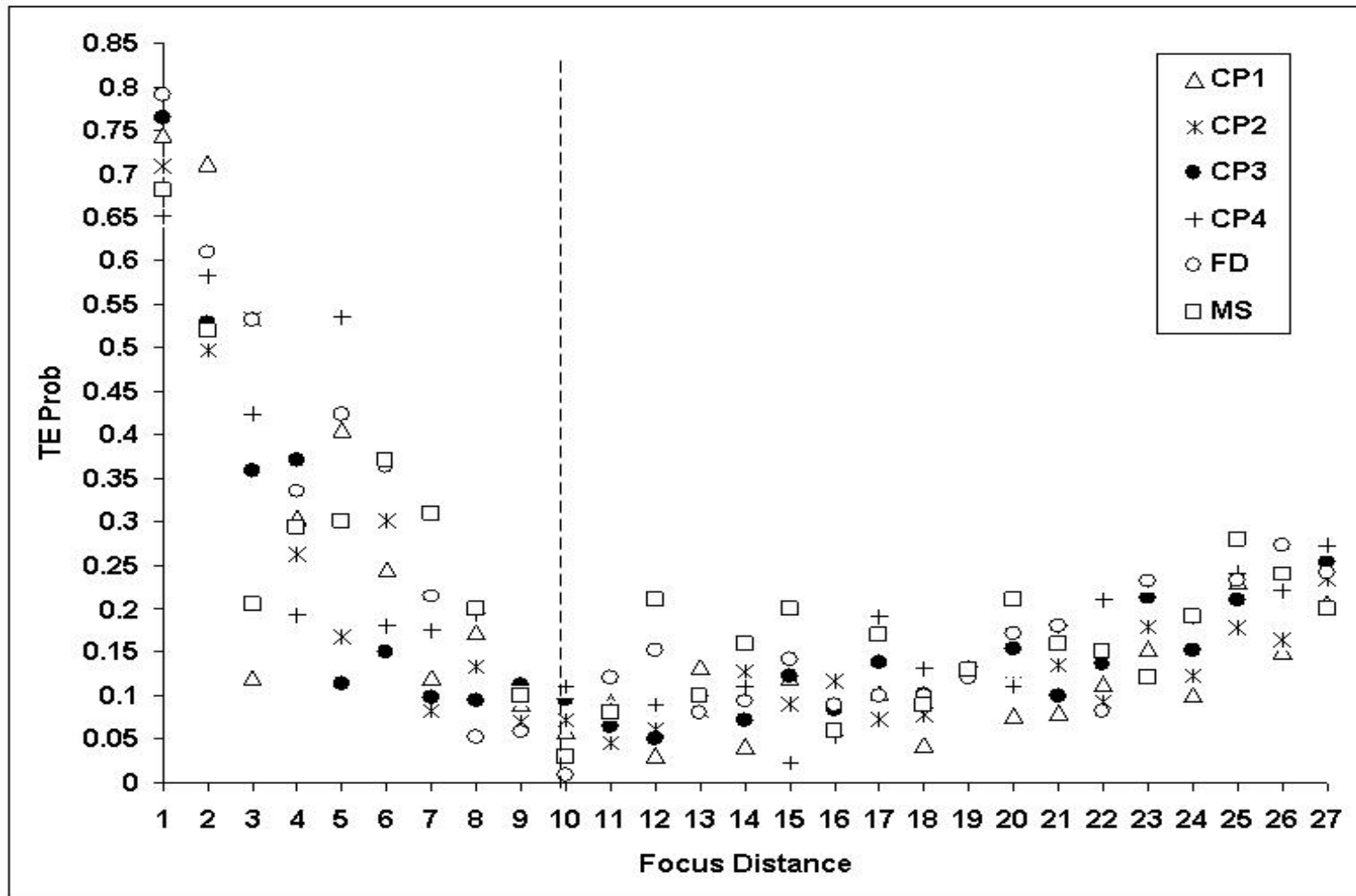


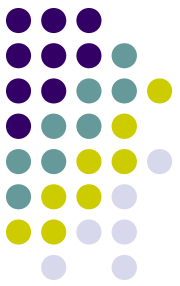
Observation: 2-level TE Dist.



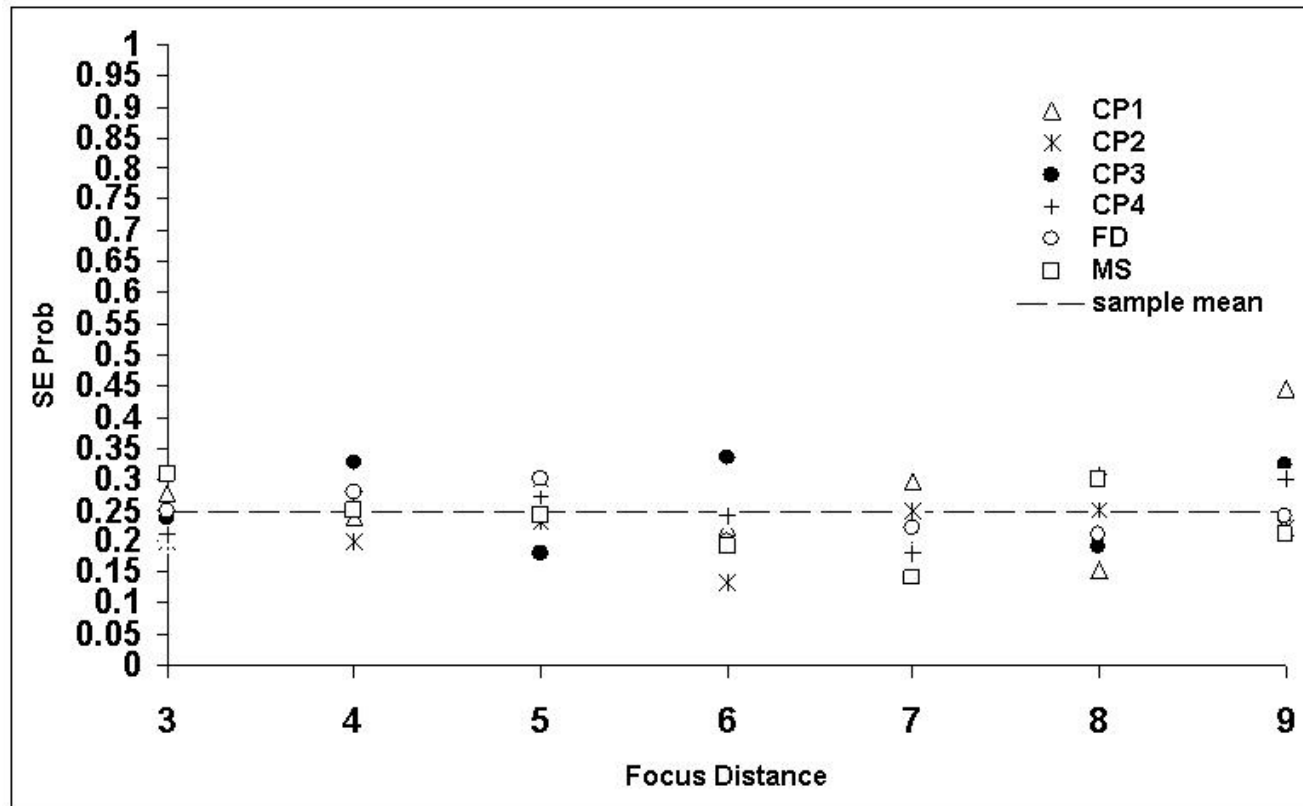


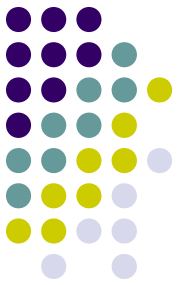
Observation: 1-level TE Dist.



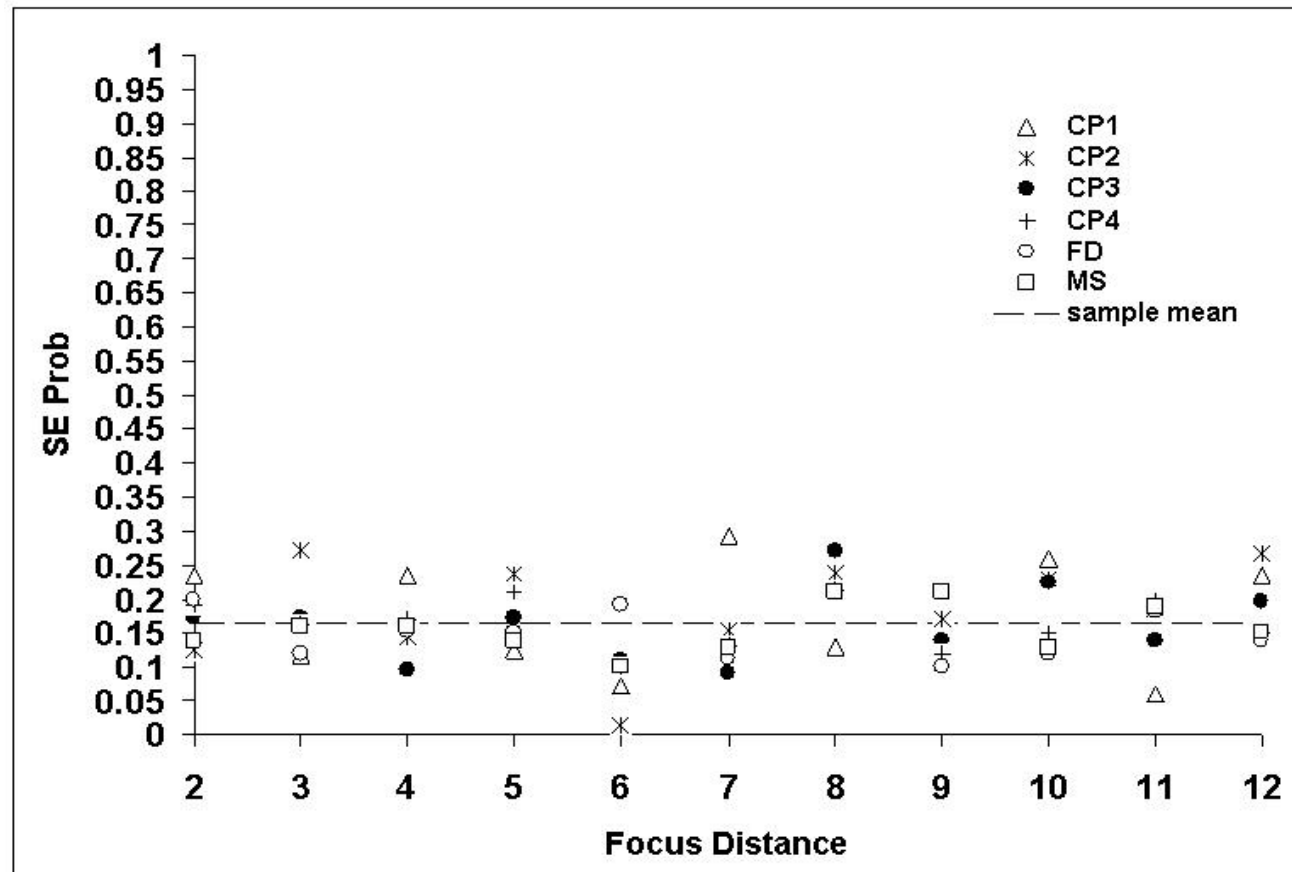


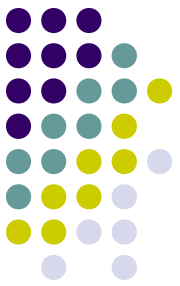
Observation: 3-level SE Dist.



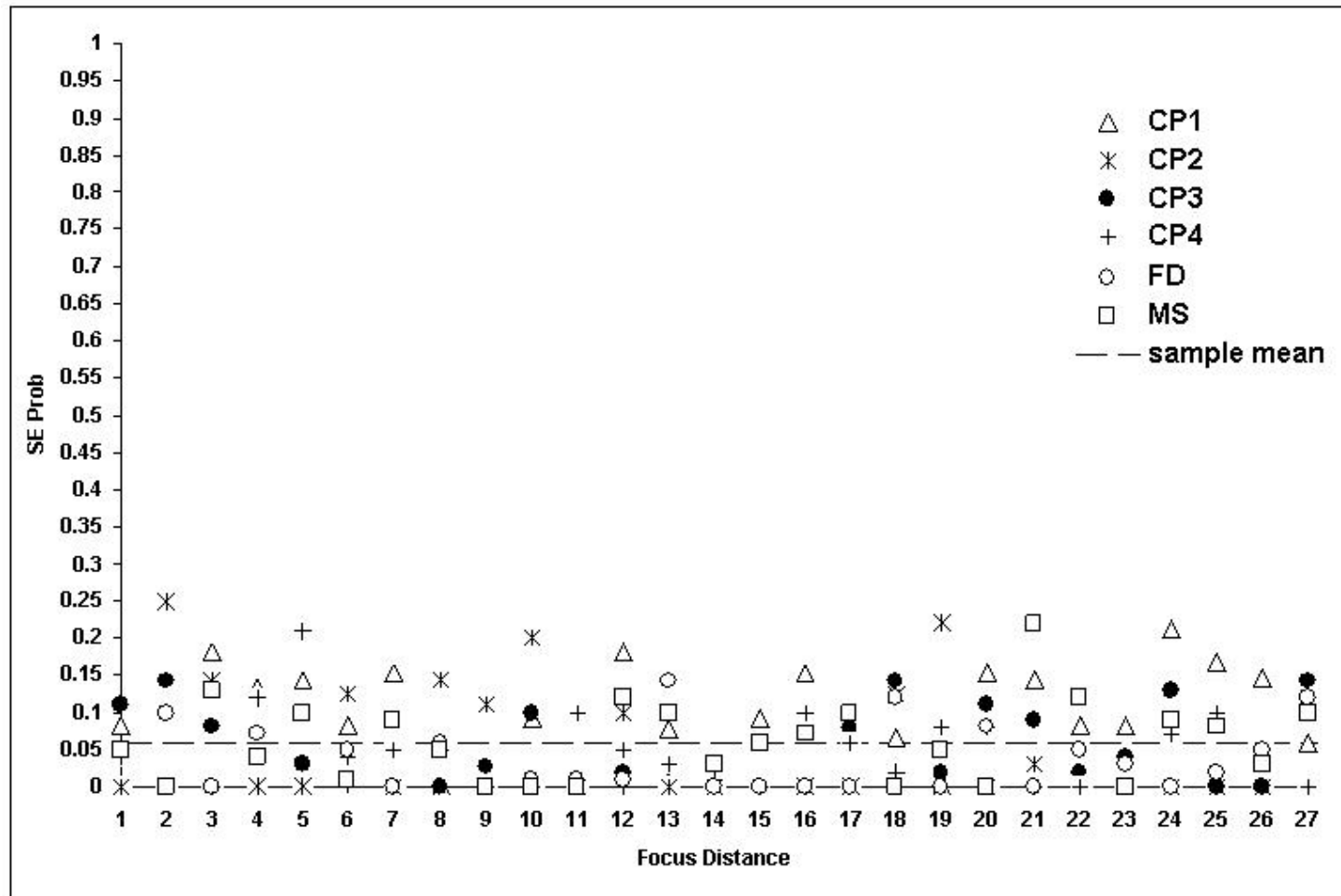


Observation: 2-level SE Dist.

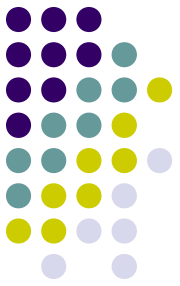




Observation: 1-level SE Dist.

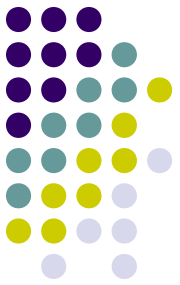


Model Implication: Design Principles



- ❑ To reduce error, frequently selected char pairs should be placed apart by
 - $f_{\min} + R_f/2$ for 3-level
 - $f_{\min} + R_f/3$ for 1-level
 - $f_{\max}$ for 2-level
- ❑ Effect on text entry rate?
 - Interviewed subjects
 - They preferred high text entry rate if error prob is low (1 and 2-level), reduced error if error prob is high (3-level)
- ❑ Principle important for 3-level, apply with care for 1 and 2-levels

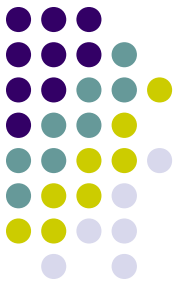
Model Implication: Computational Model



- Distribution function for TE

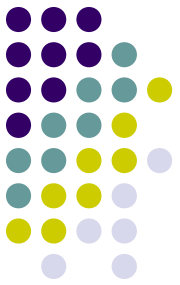
$$\begin{aligned} P_{TE}(f) \\ &= P_0 \cdot e^{-\lambda_0(f-f_{\min})} \quad f_{\min} \leq f \leq f_c \\ &= P_1 \cdot e^{\lambda_1(f-f_c)} \quad f_c < f \leq f_{\max} \end{aligned}$$

- SE modeled with sample mean since no pattern



Computational Model

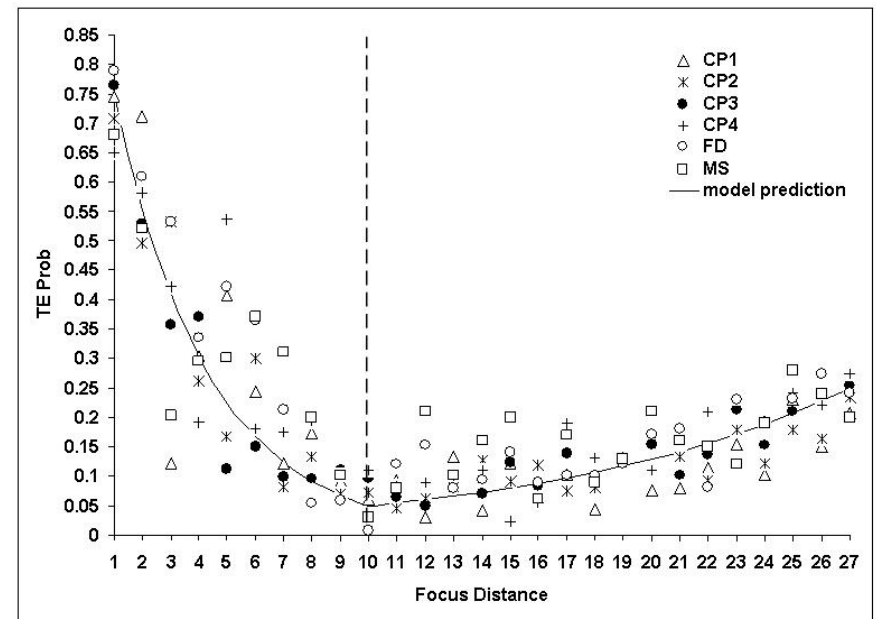
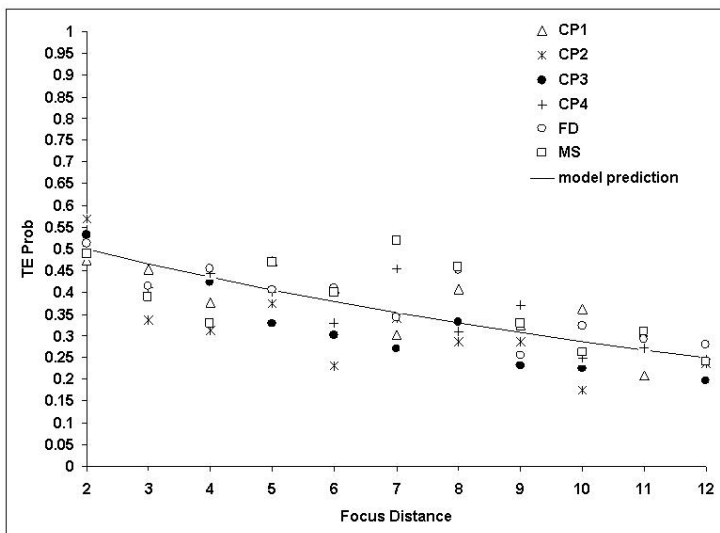
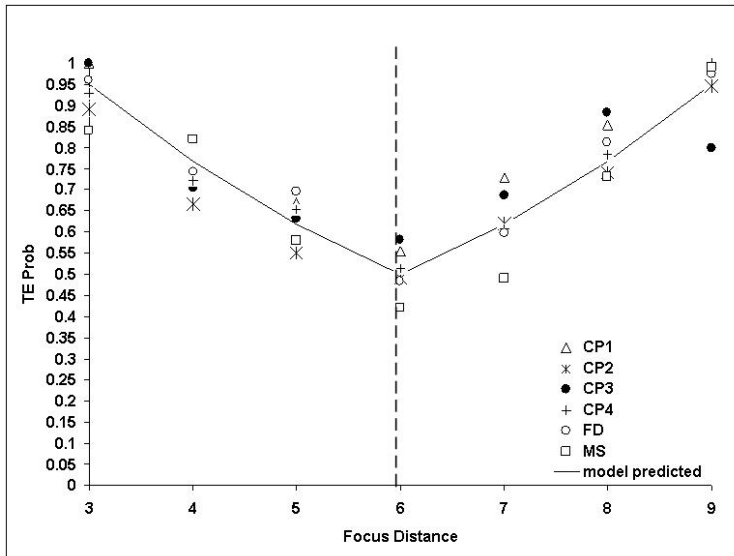
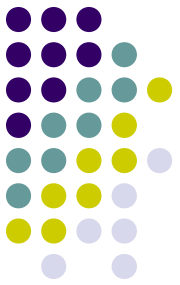
- ❑ Four parameters for TE
 - P_0 , TE prob at $f_{\min}$
 - f_c , the critical focus distance
 - P_1 , TE prob at f_c
 - P_2 , TE prob at $f_{\max}$
- ❑ One parameter for SE, sample mean or P_m
- ❑ We have estimated their values from empirical data



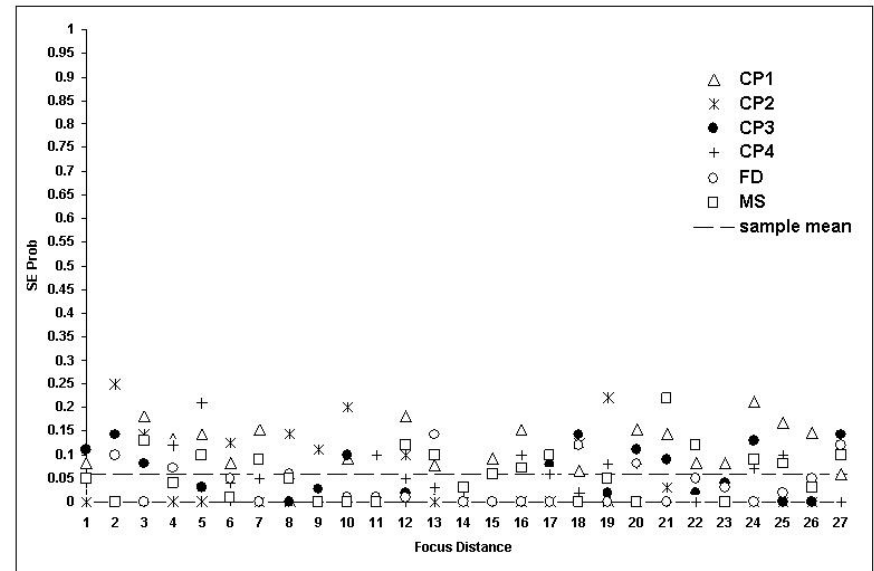
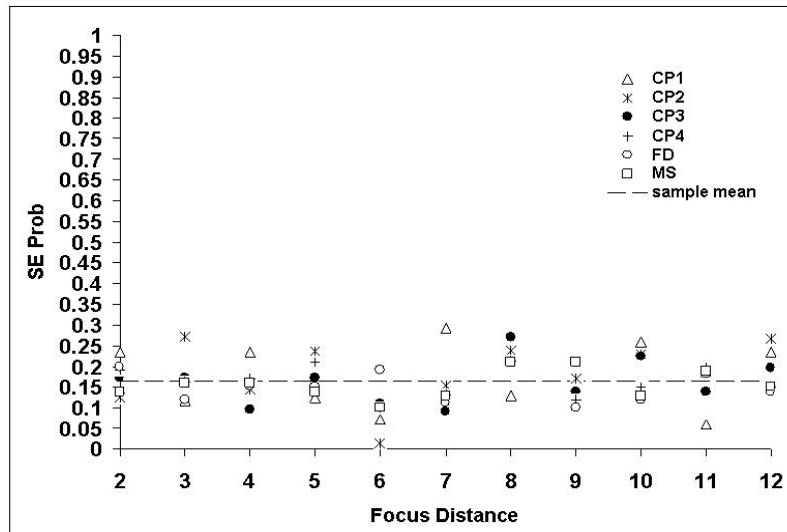
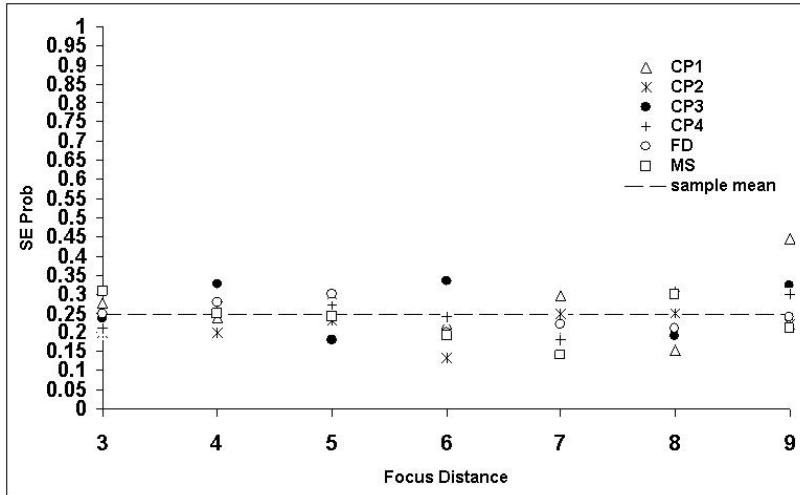
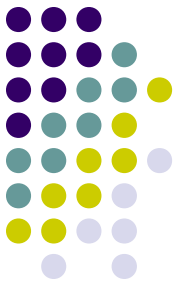
Parameter Values

Scanning type	Parameter values
3-level	$P_0 \approx 0.95, P_1 \approx 0.5, P_2 \approx 0.95$ $f_c \approx f_{\min} + R_f/2$ $\lambda_0 = (1/(R_f/2))\ln 2, \lambda_1 = (1/(R_f-1)-R_f/2))\ln 2$ $P_m \approx 0.25$
2-level	$P_0 \approx 0.5, P_1 = 0, P_2 \approx 0.5$ $f_c \approx f_{\max}$ $\lambda_0 = (1/(R_f-1))\ln 2$ $P_m \approx 0.15$
1-level	$P_0 \approx 0.75, P_1 \approx 0.05, P_2 \approx 0.25$ $f_c \approx f_{\min} + R_f/3$ $\lambda_0 = (1/(R_f/3))\ln 15, \lambda_1 = (1/((R_f-1)-R_f/3))\ln 5$ $P_m \approx 0.05$

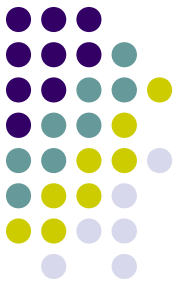
Observation: TE Dist.



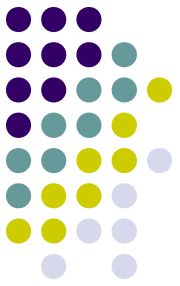
Observation: SE Dist.



The ErrorProneness (EP) Measure



- ❑ A numerical measure of the effect of errors for scanning keyboards
- ❑ Developed from the distribution functions
- ❑ EP of a scanning keyboards
 - Joint prob. of TE and SE
 - The higher the EP, the less the keyboards ability to prevent errors



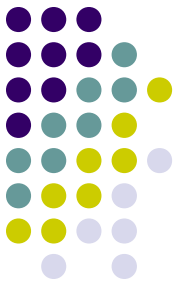
EP Calculation

- Calculate average focus distance, f_{mean}

$$f_{\text{mean}} = \sum_{i=1}^K \sum_{j=1}^K DP_{ij} \times f_{ij}$$

- Calculate joint error prob for f_{mean} , assuming mutual independence

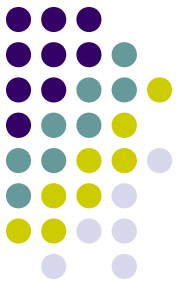
$$EP = P_m \times P_{TE}(f_{\text{mean}})$$



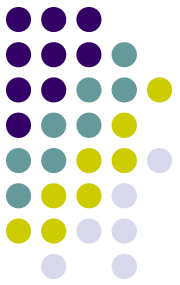
Comparing Interfaces

- ❑ Let we have a set of interfaces
- ❑ Compute the following for each interface
 - Error free text entry rate (t)
 - EP (e)
- ❑ Compare the interfaces based on these two measures

Relationship between two interfaces (s1, s2)

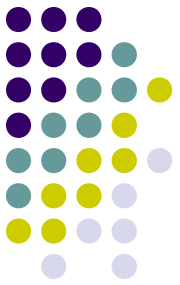


Notation	Relation
r1	$t1 < t2, e1 < e2$
r2	$t1 < t2, e1 = e2$
r3	$t1 < t2, e1 > e2$
r4	$t1 = t2, e1 < e2$
r5	$t1 = t2, e1 = e2$
r6	$t1 = t2, e1 > e2$
r7	$t1 > t2, e1 < e2$
r8	$t1 > t2, e1 = e2$
r9	$t1 > t2, e1 > e2$



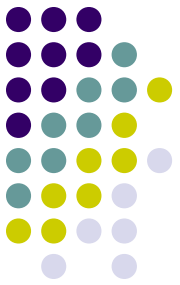
Choosing the Better

- ❑ s1 better than s2 for r4, r7, r8
- ❑ s2 better than s1 for r2, r3, r6
- ❑ They are equal for r5
- ❑ For 3-level scanning, s1 better than s2 for r1 and vice-versa for r9
- ❑ For 1-level and 2-level, s1 better than s2 for r9 and vice-versa for r1



Design Space Search

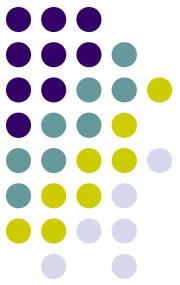
- ❑ Previous method requires designer's expertise
- ❑ Solution: search design space with algorithm
- ❑ We want an algorithm that
 - Maximizes error free text entry rate
 - Minimizes error probability
- ❑ Associated problem – optimal grouping of keys for multi-level scanning



Optimal Key Grouping

- ❑ Extended the work of Foulds et al. (1987)
- ❑ Uses a modified definition of focus distance as
 - Total shifts and switch activations starting from first block (3-level) or first row (2-level)
- ❑ Focus distance of a key
 - 3-level, $k(b,r,c) = b+r+c$
 - 2-level, $k(r,c) = r+c$
- ❑ Minimizes total focus distance of a layout

Algorithm



Set $B_{\min} = R_{\min} = C_{\min} = 2$, $B_{\max} = R_{\max} = C_{\max} = \lceil K/4 \rceil$, $i = 1$

for $b = B_{\min}$ to $B_{\max}$ **do**

for $r = R_{\min}$ to $R_{\max}$ **do**

for $c = C_{\min}$ to $C_{\max}$ **do**

if $b \times r \times c \leq K$ **then**

 generate layout $L[i]$ with b , r and c numbers of blocks, rows and items respectively

end if

$i = i + 1$

end for

end for

end for

$i = 1$

while $i < \text{length}(L)$ **do**

 Calculate focus distance for each key in $L[i]$

 Sort keys in non-decreasing order of their focus distance

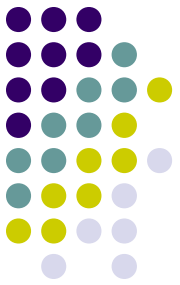
 Choose first K keys from this sorted list as the position of the characters in $L[i]$

 Calculate cost of the layout $L[i]$

$i = i + 1$

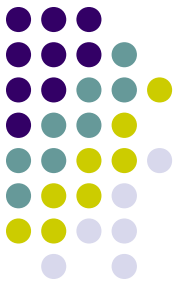
end while

Select the layout with minimum cost from L



The Search Algorithm

- ❑ For simplicity, (1/text entry rate) was taken as one of the optimization criteria
 - Transformed to minimization problem
- ❑ Starts with a random layout; grouping algorithm used for multi-level scanning
- ❑ Initial temperature, $T_0 = -\Delta E / \ln P_0$
- ❑ T is decreased by a factor α (the cooling rate) till some minimum value



Acceptance Probabilities

- Both the measures are worse

$$P_1 = 1 / (1 + e^{((\Delta_1 / (1/R') + \Delta_2 / E') / T_i)})$$

- Text entry rate better

$$P_2 = 1 / (1 + e^{(\Delta_1 / (1/R')) / T_i})$$

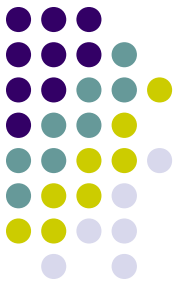
$$\Delta_1 = 1/R' - 1/R$$

$$\Delta_2 = E' - E$$

- EP is better

$$P_3 = 1 / (1 + e^{(\Delta_2 / E') / T_i})$$

Algorithm



Generate a layout at random. Calculate text entry rate and EP of the layout.
Initialize temperature. Set minimum temperature, maximum iterations and α
Initialize iteration count.

repeat

repeat

Choose two keys randomly from current layout l and swap characters
to generate l'

if $\Delta_1, \Delta_2 \leq 0$ **then**

set $l = l'$

else if $\Delta_1, \Delta_2 > 0$ **then**

calculate P_1 , if $P_1 \geq \text{rand}()$, set $l = l'$

else if $\Delta_1 > 0$ and $\Delta_2 \leq 0$ **then**

calculate P_2 , if $P_2 \geq \text{rand}()$, set $l = l'$

else

calculate P_3 , if $P_3 \geq \text{rand}()$, set $l = l'$

end if

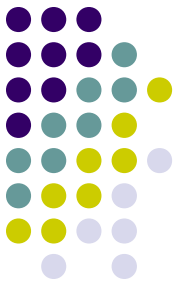
update iteration count by one

until maximum number of iterations

update T ; $T = T \times \alpha$

until $T > T_{\text{MIN}}$

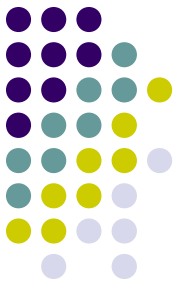
Select the current layout



User Study

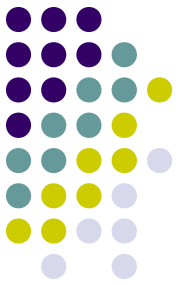
- ❑ 27 keys keyboards (26 letters + space)
- ❑ 3-level and 2-level scanning
- ❑ Developed optimized layouts
- ❑ Compared with alphabetic and randomly perturbed layouts
- ❑ Eight subjects (six with disabilities, two without)

Optimum Grouping (3-level)

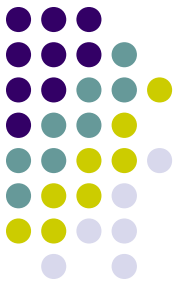


Block 1	K1	K2	K5	K11
	K3	K6	K12	K19
	K7	K13	K20	K27
Block 2	K4	K8	K14	K21
	K9	K15	K22	
	K16	K23		
Block 3	K10	K17	K24	
	K18	K25		
	K26			

Optimum Grouping (2-level)

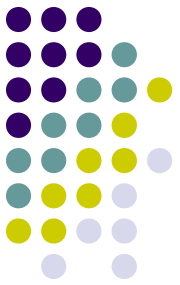


K1	K2	K4	K7	K11	K16	K22
K3	K5	K8	K12	K17	K23	
K6	K9	K13	K18	K24		
K10	K14	K19	K25			
K15	K20	K26				
K21	K27					



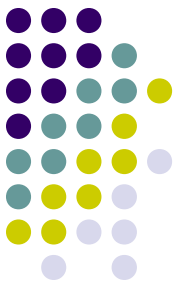
Optimum layouts

- ❑ $T = 1 \text{ sec}, T_{\text{MIN}} = 0.01$
- ❑ $P_0 = 0.8$
- ❑ $\alpha = 0.99$
- ❑ Number of iteration for each temp = 1000
- ❑ ΔE = average text entry rate diff for twenty random layouts

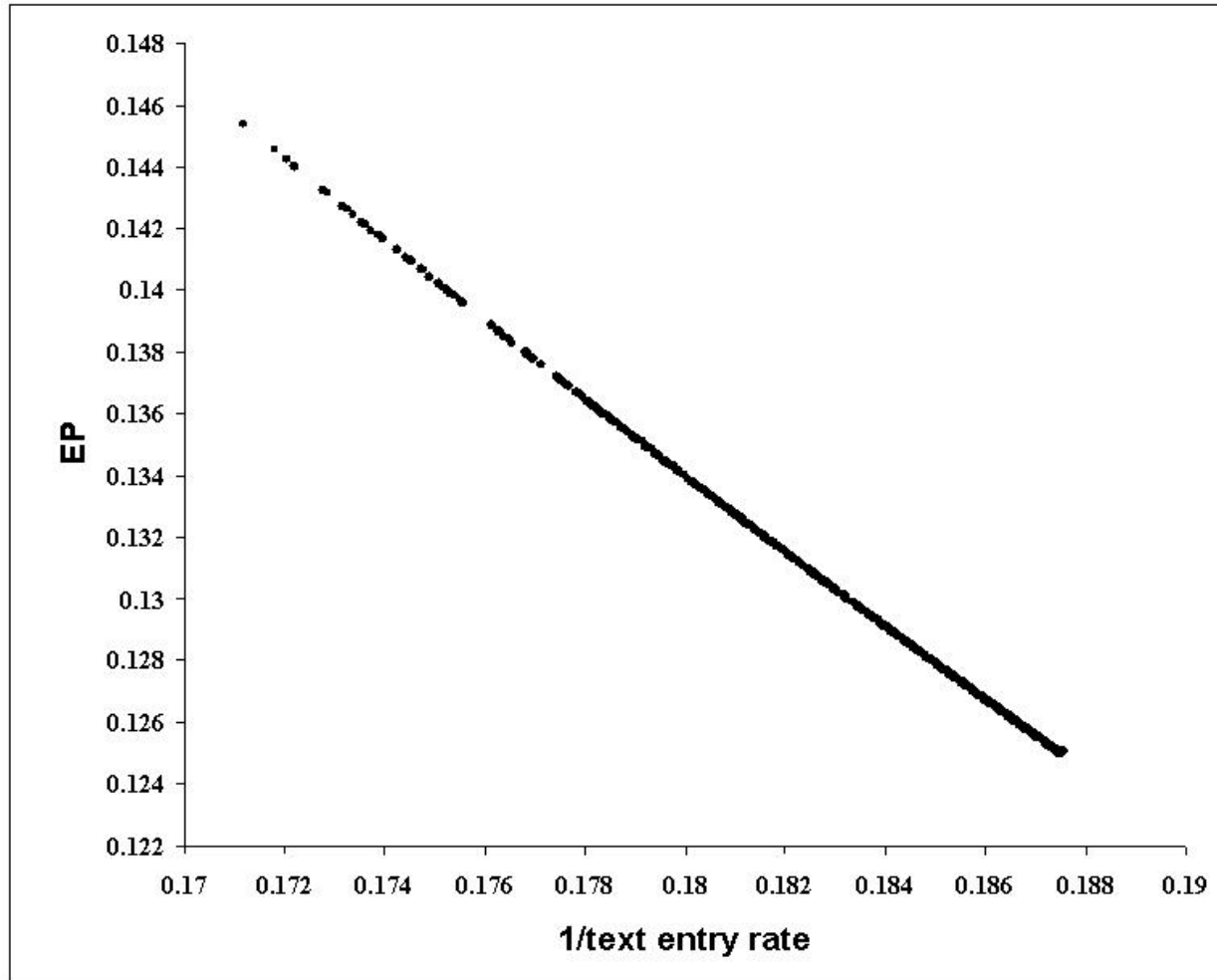


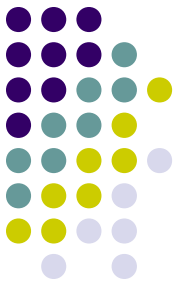
Some Statistics

- ❑ Each run considered 90,90,000 layouts
- ❑ Output of each run—a near optimum solution
- ❑ 1000 solution points generated for each
- ❑ These formed the Pareto fronts

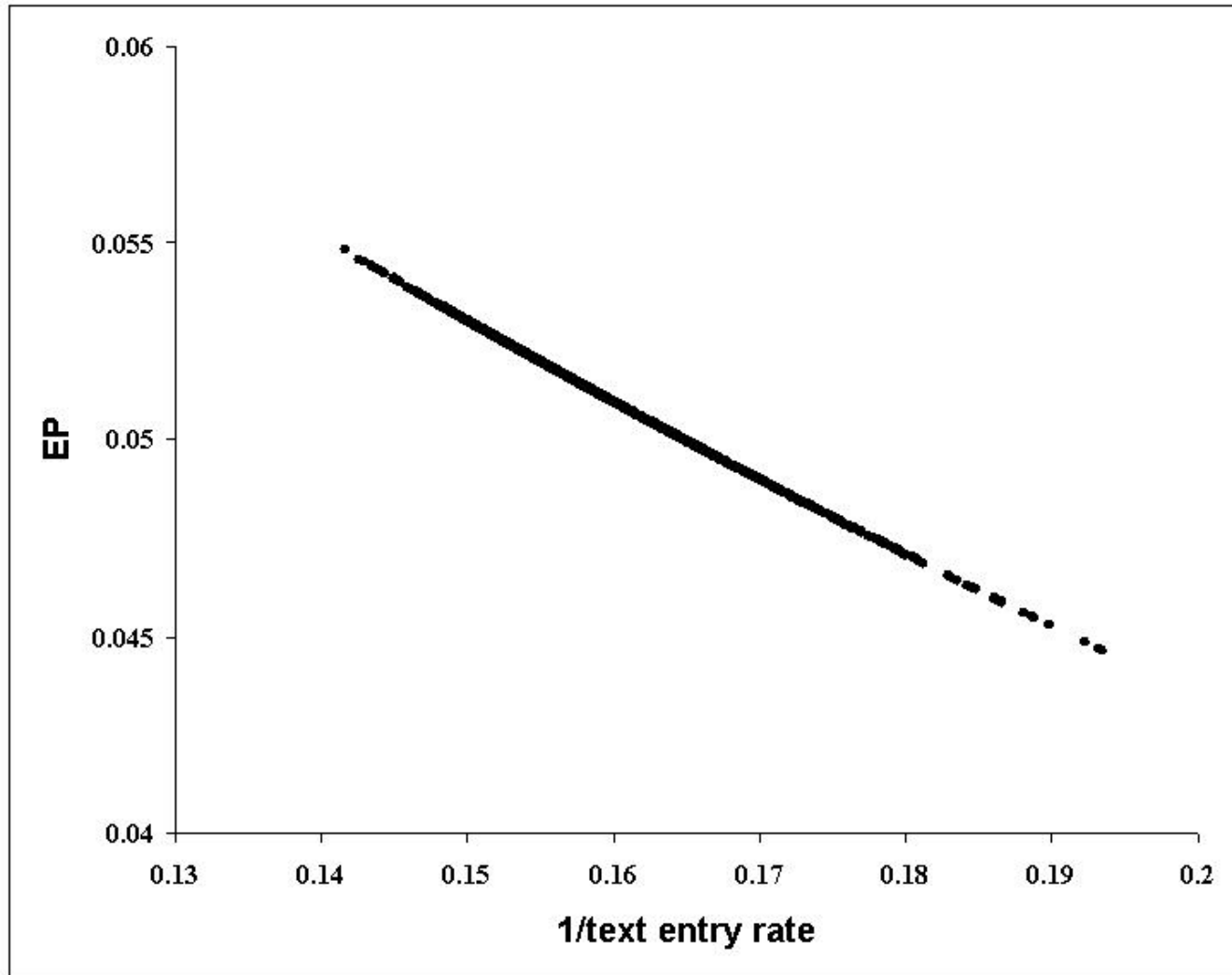


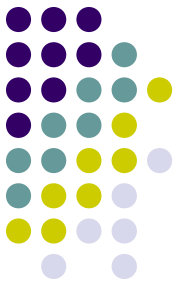
Pareto Front for 3-level





Pareto Front for 2-level

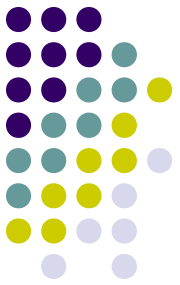




Final Designs

- Design with least EP for 3-level

Space	P	G	B	●
Y	M	D	N	×
E	Z	X	O	×
V	C	W	H	●
T	I	Q	×	
U	S	×		
J	L	K	●	
R	F	×		
A	BkSpC	×		

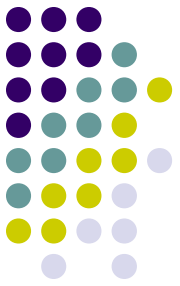


Final Designs

- Design with highest text entry rate for 2-level

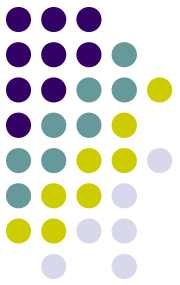
T	M	K	X	I	B	S	✗
G	Z	C	A	F	D		✗
N	Q	Y	W	Space			✗
L	O	J	P				✗
H	R	V					✗
E	U	BkSp					✗

Other Layouts: Alphabetic



A	B	C	D	●
E	F	G	H	×
I	J	K	L	×
M	N	O	P	●
Q	R	S	×	
T	U	×		
V	W	X	●	
Y	Z	×		
Space	BkSpc	×		

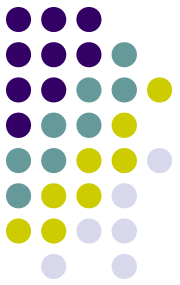
A	B	C	D	E	F	G	×
H	I	J	K	L	M		×
N	O	P	Q	R			×
S	T	U	V				×
W	X	Y					×
Z	Space	BkSpC					×



Other Layouts: Perturbed

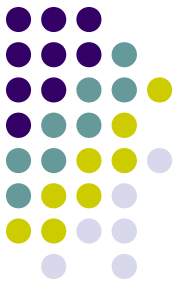
S	P	G	B	●
Y	M	D	K	×
E	Z	X	O	×
V	R	W	H	●
T	I	Q		×
U	Space			×
J	L	N		●
C	F			×
A	BkSpc			×

T	M	N	X	I	B	Space	×
G	Z	R	A	F	D		×
K	Q	Y	W	S			×
L	O	J	P				×
H	C	V					×
E	U	BkSpc					×



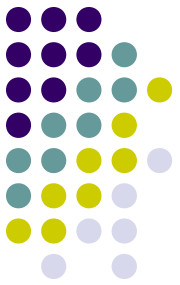
Predicted Performance

Interface	Text entry rate	EP
OPT_3SK	5.33	0.125
ALPH_3SK	5.11	0.135
PERT_3SK	5.27	0.127
OPT_2SK	7.06	0.054
ALPH_2SK	6.56	0.052
PERT_2SK	5.81	0.049



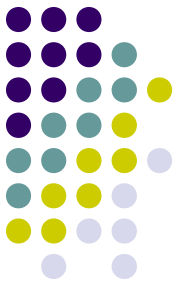
Expected

- ❑ OPT_3SK should have less probability of error (i.e. lower EP) than the other two
- ❑ OPT_2SK should have higher text entry rates than the other two



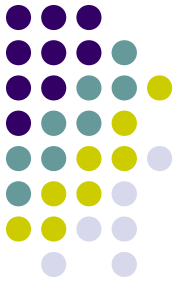
Observations

- ❑ For 3-level, all the subjects had higher text entry rate and lower EP with OPT_3SK than the other two
- ❑ For 2-level, all the subjects had higher text entry rate with OPT_2SK. However, in a few cases, subjects had more errors with the optimum design



Further Work

- ❑ More data for refinement and further validation
- ❑ Visual search incorporation
- ❑ Other multi-objective algorithms for design space search
- ❑ Predictive and ambiguous keyboards
- ❑ Extension to other scanning aids
- ❑ Scan step determination
- ❑ Automatic usability evaluation framework



Thank You