

Human Performance Modeling

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CS-570 Introduction to Human-computer Interaction



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User Performance Modeling

Quantitatively predict what people will do before you build a system.

Also called:

Human Behavior Modeling (military)

Cognitive Modeling

Computational Cognitive Modeling

Cognitive Performance Modeling

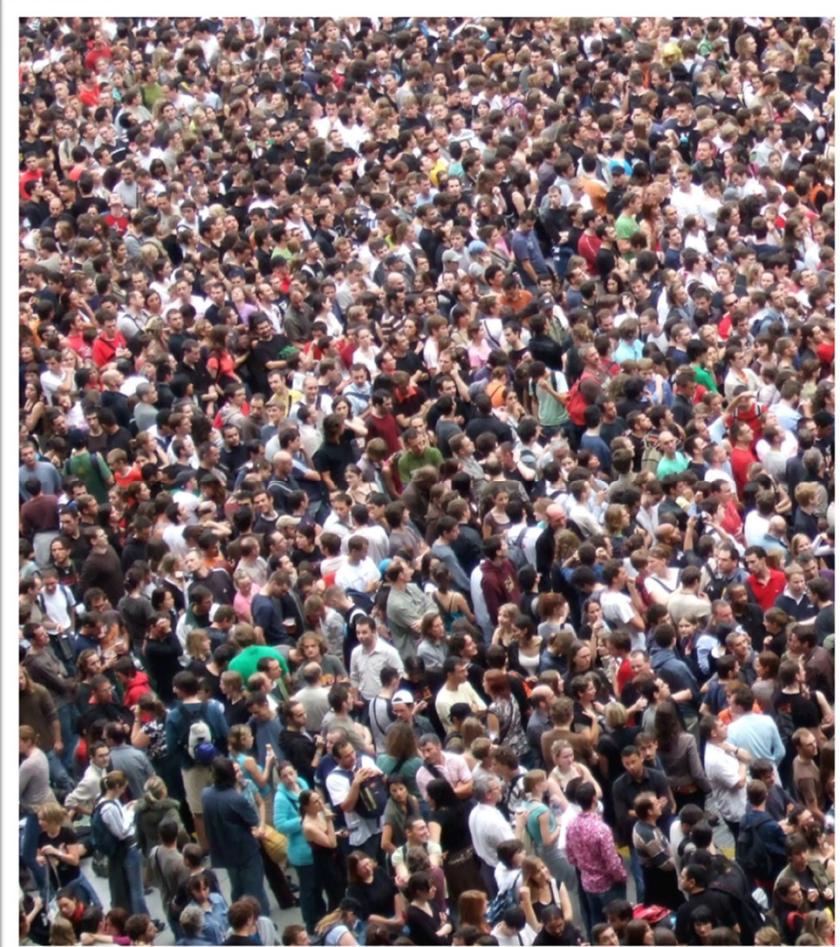
Why Model?



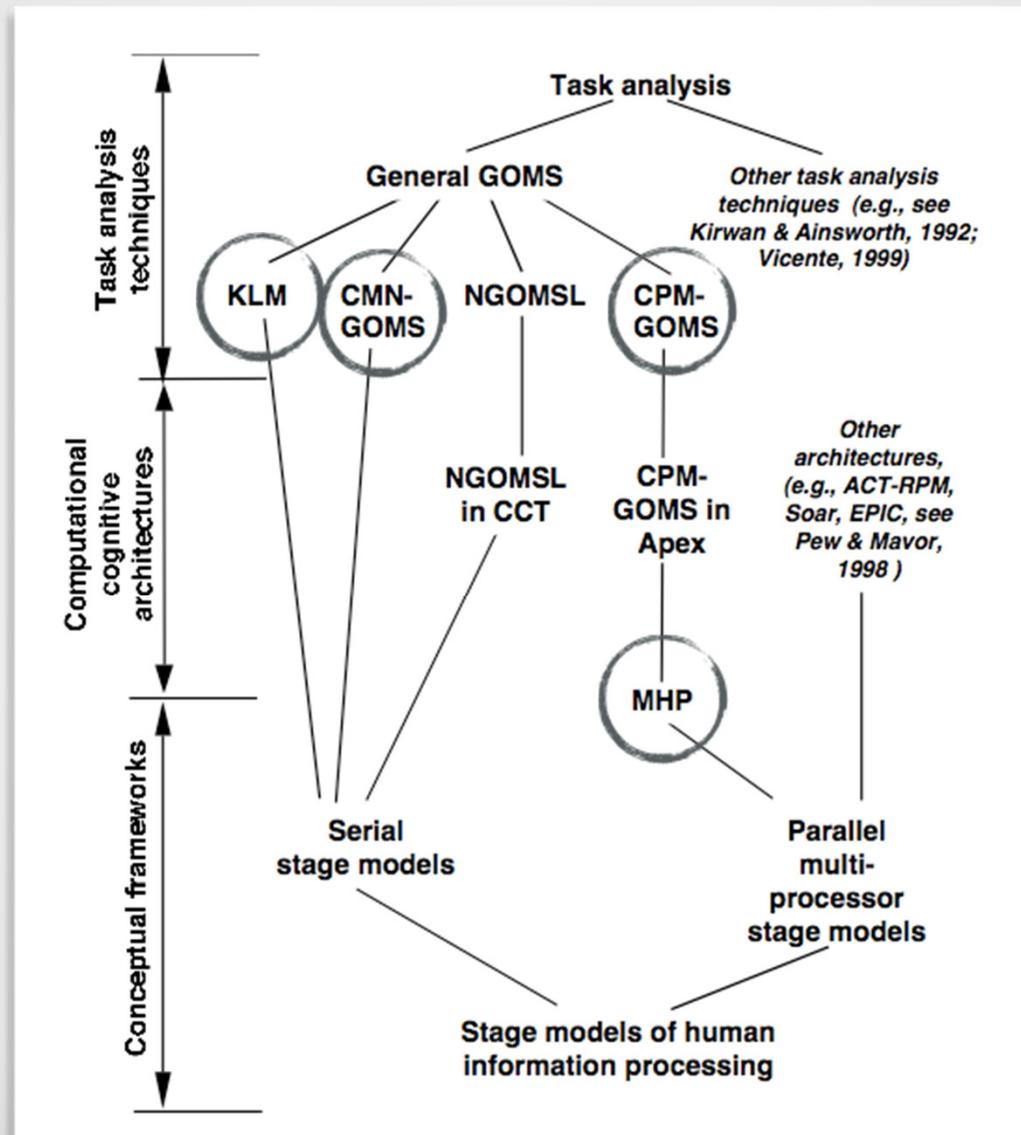


Task	Greenphone	iPhone	Neo1973
Add a contact	21.022 sec 22 keystrokes	20.150 sec 20 keystrokes	40.018 sec 26 keystrokes
Send an SMS	14.912 sec 14 keystrokes	16.100 sec 10 keystrokes	18.025 sec 11 keystrokes
Add a number from a call	22.240 sec 12 keystrokes	16.600 sec 8 keystrokes	18.868 sec 13 keystrokes
Call a contact	4.921 sec 4 keystrokes	10.600 sec 4 keystrokes	7.988 sec 5 keystrokes
Change a contact name	22.326 sec 28 keystrokes	24.100 sec 16 keystrokes	41.688 sec 16 keystrokes

Modeling Humans



Taxonomy of Modeling



Model Human Processor (MHP)

Goals

Provide approximate predictions of gross human behavior

Help remember theory & facts about HCI

Provide “good enough” answers to guide design

Provide explanations for & support empirical results

Questions the MHP **can** answer

How long will it take to do a task on the computer?

Prediction

Is design A likely to be “better” (faster) than design B?

Explanation

Why is design A “better” (faster) than design B?

Questions MHP **can't** answer

User preferences, likeability, desirability

Complex problem-solving & learning

Questions dealing with the subtleties of human behavior, creative thoughts, humor, etc.

Example:

When I **knock** on the table,
you **knock** on the table.

Observation:

Knock

... short pause ...

knock

Why the pause?

Model Human Processor Subsystems

Three interacting systems

Perceptual system — hear knock

Cognitive system — process knock

Motor system — respond with knock

Each subsystem has:

A processor

Memories it interacts with

LONG-TERM MEMORY

$$\begin{aligned}\delta_{LTM} &= \infty \\ \mu_{LTM} &= \infty \\ \kappa_{LTM} &= \text{semantic}\end{aligned}$$

WORKING MEMORY

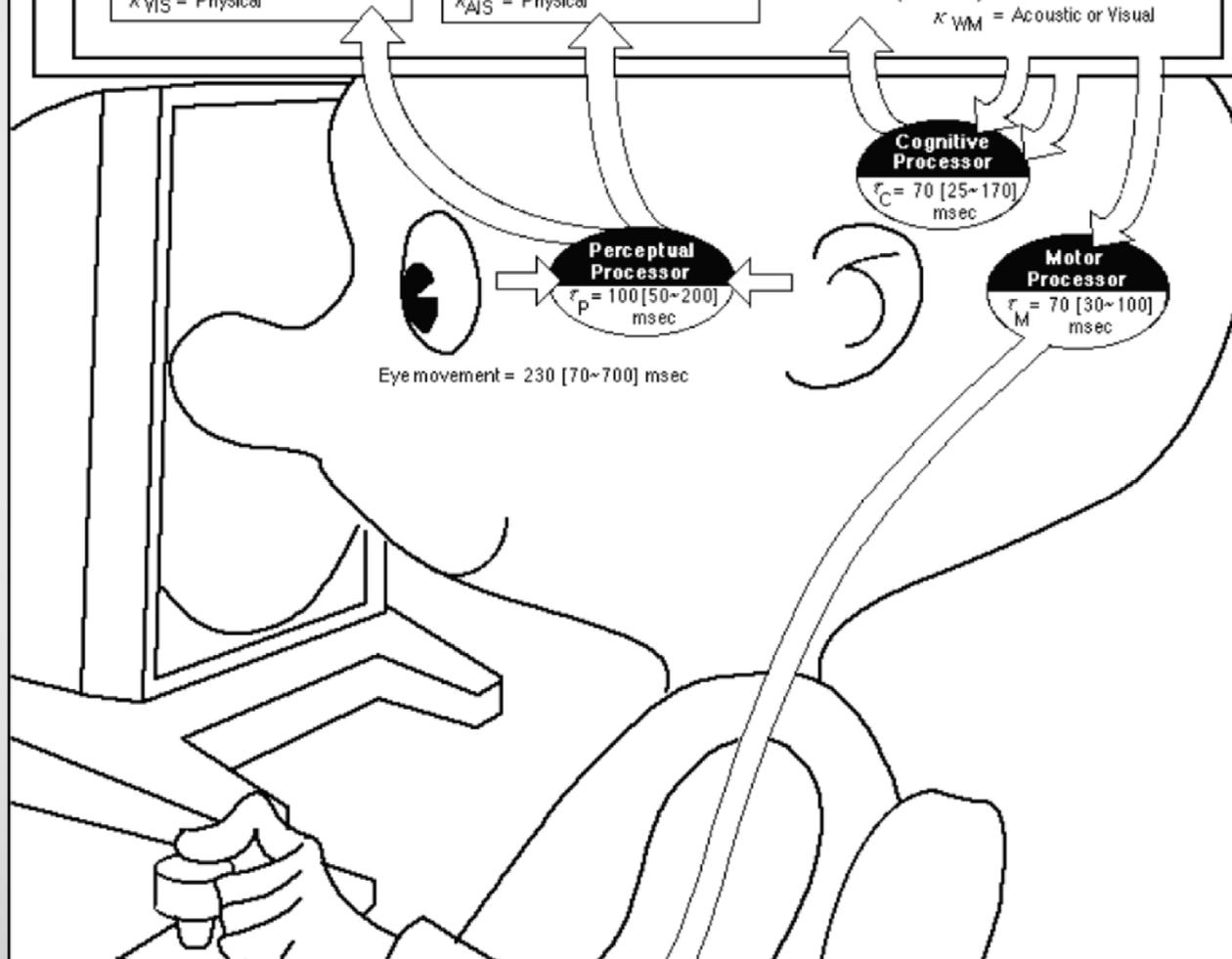
VISUAL IMAGE STORE

$$\begin{aligned}\delta_{VIS} &= 200 [70 \sim 1000] \text{ msec} \\ \mu_{VIS} &= 17 [7 \sim 17] \text{ letters} \\ \kappa_{VIS} &= \text{Physical}\end{aligned}$$

AUDITORY IMAGE STORE

$$\begin{aligned}\delta_{AIS} &= 1500 [900 \sim 3500] \text{ msec} \\ \mu_{AIS} &= 5 [4.4 \sim 6.2] \text{ letters} \\ \kappa_{AIS} &= \text{Physical}\end{aligned}$$

$$\begin{aligned}\mu_{WM} &= 3 [2.5 \sim 4.1] \text{ chunks} \\ \mu_{WM^*} &= 7 [5 \sim 9] \text{ chunks} \\ \delta_{WM} &= 7 [5 \sim 226] \text{ sec} \\ \delta_{WM(1 \text{ chunk})} &= 73 [73 \sim 226] \text{ sec} \\ \delta_{WM(3 \text{ chunks})} &= 7 [5 \sim 34] \text{ sec} \\ \kappa_{WM} &= \text{Acoustic or Visual}\end{aligned}$$



Parameters

Memory parameters

∂ = Decay time of an item

μ = Storage capacity in items

κ = Code type (physical, acoustic, visual, semantic)

Processor parameter

τ = Cycle time

LONG-TERM MEMORY

$\Delta_{LTM} = \infty$
 $\Delta_{LTM} = \infty$
 $\Delta_{LTM} = \text{seconds}$

WORKING MEMORY

VISUAL IMAGE STORE

$\Delta_{VIS} = 200(10-1000) \text{ msec}$
 $\Delta_{VIS} = 17(7-17) \text{ items}$
 $\Delta_{VIS} = \text{Phonemes}$

AUDITORY IMAGE STORE

$\Delta_{AUS} = 1500(300-3500) \text{ msec}$
 $\Delta_{AUS} = 5(3-6) \text{ items}$

$\Delta_{WM} = 3(2.5-4.5) \text{ chunks}$
 $\Delta_{WM} = 7(5-9) \text{ chunks}$
 $\Delta_{WM} = 7(5-200) \text{ sec}$
 $\Delta_{WM}(\text{chunk}) = 73(73-128) \text{ sec}$
 $\Delta_{WM}(\text{chunk}) = 7(5-34) \text{ sec}$

Different values for
different subsystems

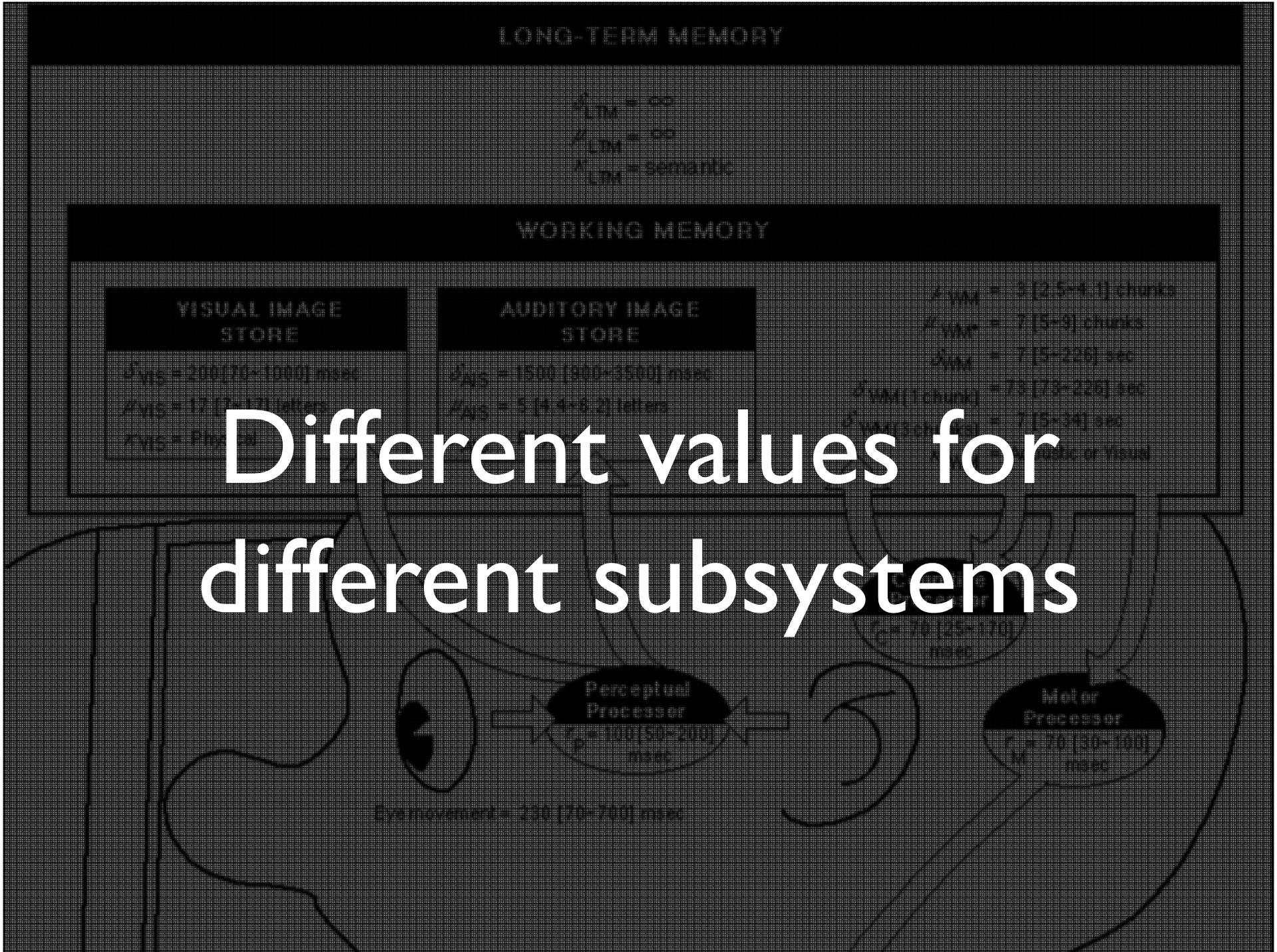
Perceptual Processor

$\Delta_{PP} = 100(50-200) \text{ msec}$

Motor Processor

$\Delta_{MP} = 70(30-100) \text{ msec}$

Eye movement = 200(10-700) msec



Model Assumptions

Slow users, middle speed users, fast users

Quantitative values are shown as middle speed

LONG-TERM MEMORY

$\Delta_{LTM} = 100$
 $\Delta_{LTM} = 100$
 $\Delta_{LTM} = 30000$

WORKING MEMORY

VISUAL IMAGE STORE

$\Delta_{VIS} = 500(100-1000)$ msec
 $\Delta_{VIS} = 17(7-17)$ chunks
 $\Delta_{VIS} =$

AUDITORY IMAGE STORE

$\Delta_{AUS} = 1500(900-3500)$ msec
 $\Delta_{AUS} = 5(0.4-5.2)$ chunks

$\Delta_{WM} = 3(2.5-4.5)$ chunks

$\Delta_{WM} = 7(5-9)$ chunks

$\Delta_{WM} = 7(5-200)$ sec

$\Delta_{WM}(\text{chunks}) = 73(70-120)$ sec

$\Delta_{WM}(\text{chunks}) = 7(5-30)$ sec

$\Delta_{WM} =$

Parameters based on
empirical research

Perceptual
Processor

$\Delta_{PP} = 100(50-200)$
msec

Motor
Processor

$\Delta_{MP} = 70(30-100)$
msec

Eye movement = 200(100-700) msec

10 Principles of Operation

P0. Recognize-act cycle of cognitive processor

P1. Variable perceptual processor rate principle

P2. Encoding specificity principle

P3. Discrimination principle

P4. Variable cognitive processor rate principle

P5. Fitt's law

P6. Power law of practice

P7. Uncertainty principle

P8. Rationality principle

P9. Problem space principle

**What do we do with
this stuff?**

Example 1

Problem:

How long will it take someone to tell you the solution to a simple arithmetic problem on the screen?

$$3 \times 7 = ?$$

Steps to solving

1. Read numbers [perceptual processor]
2. Identify numbers [long-term memory]
3. Understand problem [working memory + cognitive processor]
4. Recall solution [long-term memory]
5. Map solution to keys [perceptual processor + long-term memory]
6. Type in solution [motor processor + perceptual processor]

Table 45.2. Cognitive Processing Rates

Rate at which an item can be matched against working memory:			
Digits	33 [27~39]	msec/item	Cavanaugh (1972)
Colors	38	msec/item	Cavanaugh (1972)
Letters	40 [24~65]	msec/item	Cavanaugh (1972)
Words	47 [36~52]	msec/item	Cavanaugh (1972)
Geometric shapes	50	msec/item	Cavanaugh (1972)
Random forms	68 [42~93]	msec/item	Cavanaugh (1972)
Nonsense syllables	73	msec/item	Cavanaugh (1972)
	<i>Range = 27~93 msec/item</i>		
Rate at which four or fewer objects can be counted:			
Dot patterns	46	msec/item	Chi & Klahr (1975)
3-D shapes	94 [40~172]	msec/item	Akin & Chase (1978)
	<i>Range = 40~172 msec/item</i>		
Perceptual judgment:	106 [85~169]	msec/inspection	Welford (1976)
Choice reaction time:	92 msec/inspection		Welford (1973)
	153 msec/bit		Hyman (1953)
Silent counting rate:	167 msec/digit		Landauer (1962)

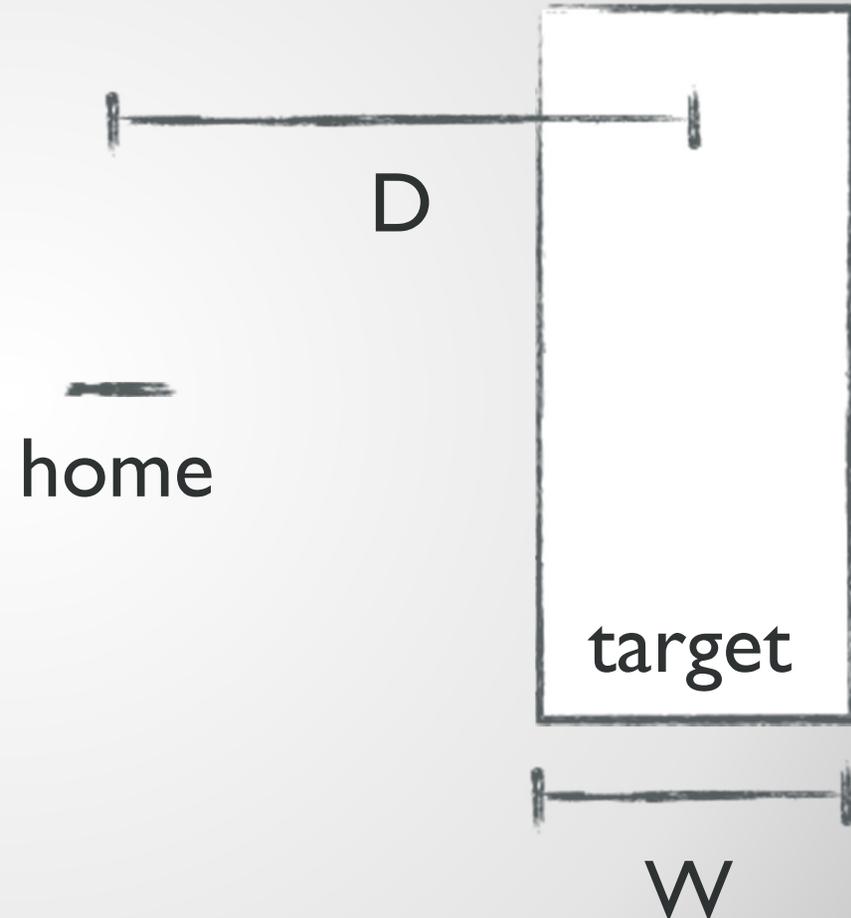
This table gives cycle times (msec per cycle) from various experimental paradigms that might be identified with the cognitive processor cycle time. (1) The rates at which an item can be matched against working memory are measured using Sternberg's (1975) paradigm in which the time is recorded for a subject to say whether a new item is in a previously presented list. The times per item given here are the slopes of the response times as a function of the number of items in the previously presented list. (2) The rate at which four or fewer objects can be counted are from subitizing experiments measuring the time for

P5. Fitts' Law

Fitts' Law predicts pointing movements

Modeling pointing movements

Predicts that time required to rapidly move to a target is a function of the distance to and size of the target.



Fitts' Law Parameters

T – the average time taken to complete the movement.

a – the start/stop time of the device (constant)

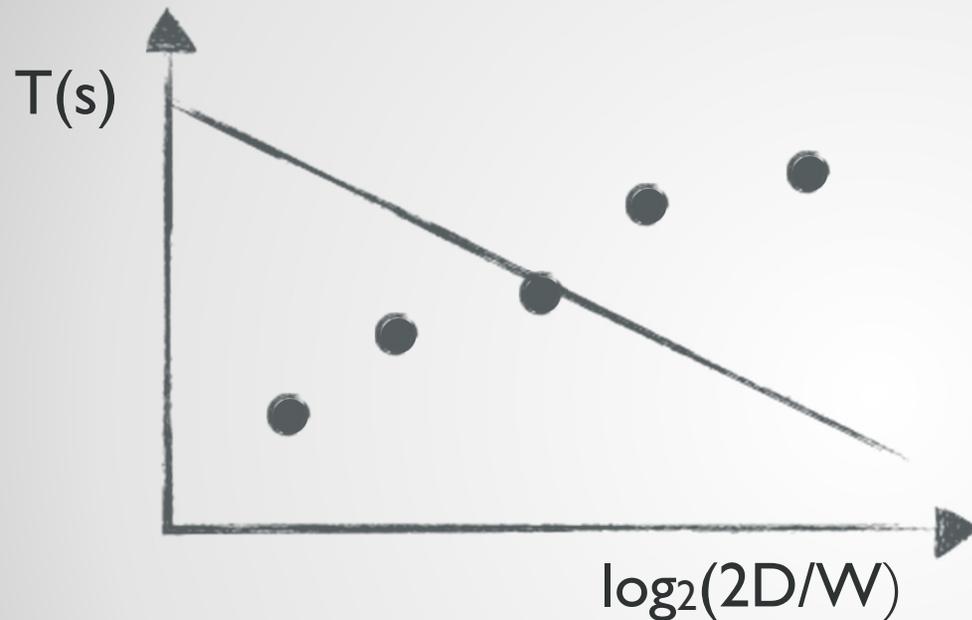
b – the inherent speed of the device (constant)

D – the distance from the starting point to the center of the target

W – the width of the target measured along the axis of motion

$$T = a + b * ID \quad ID = \log_2^*(2*D/W)$$

Fitts' Law



$$T = a + b \cdot \log_2(2 \cdot D/W)$$

T – the average time taken to complete the movement.

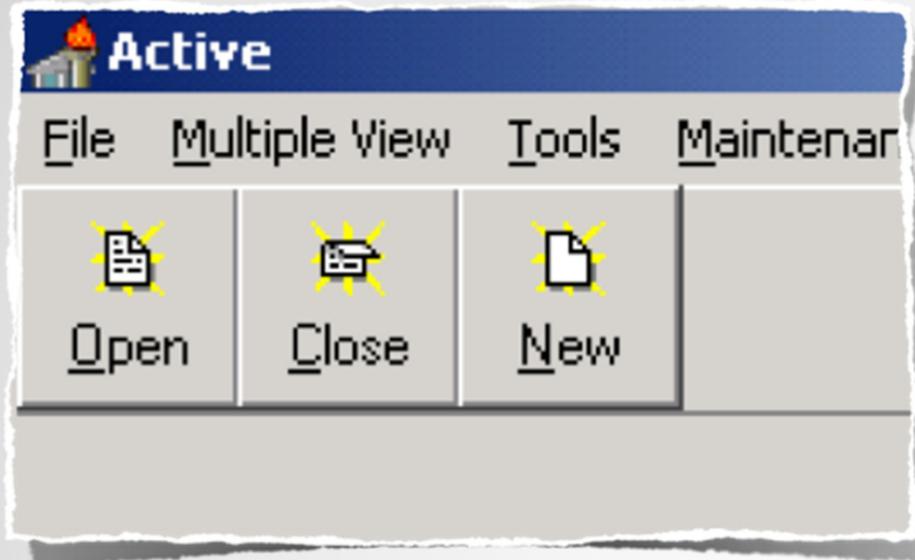
a – the start/stop time of the device (constant)

b – the inherent speed of the device (constant)

D – the distance from the starting point to the center of the target

W – the width of the target measured along the axis of motion

Why does Fitts' Law matter?



Summary

Goals of the Model Human Processor

Helps us make approximate predictions of gross human behavior

Helps us remember facts & predict human-computer interaction behavior

Informs design decisions when data not available

Helps explain data when it is

Model Human Processor consists of:

3 interconnected memories & processors

10 principles of operation

Summarized by 4 parameter values:

μ = Storage capacity in items

∂ = Decay time of an item

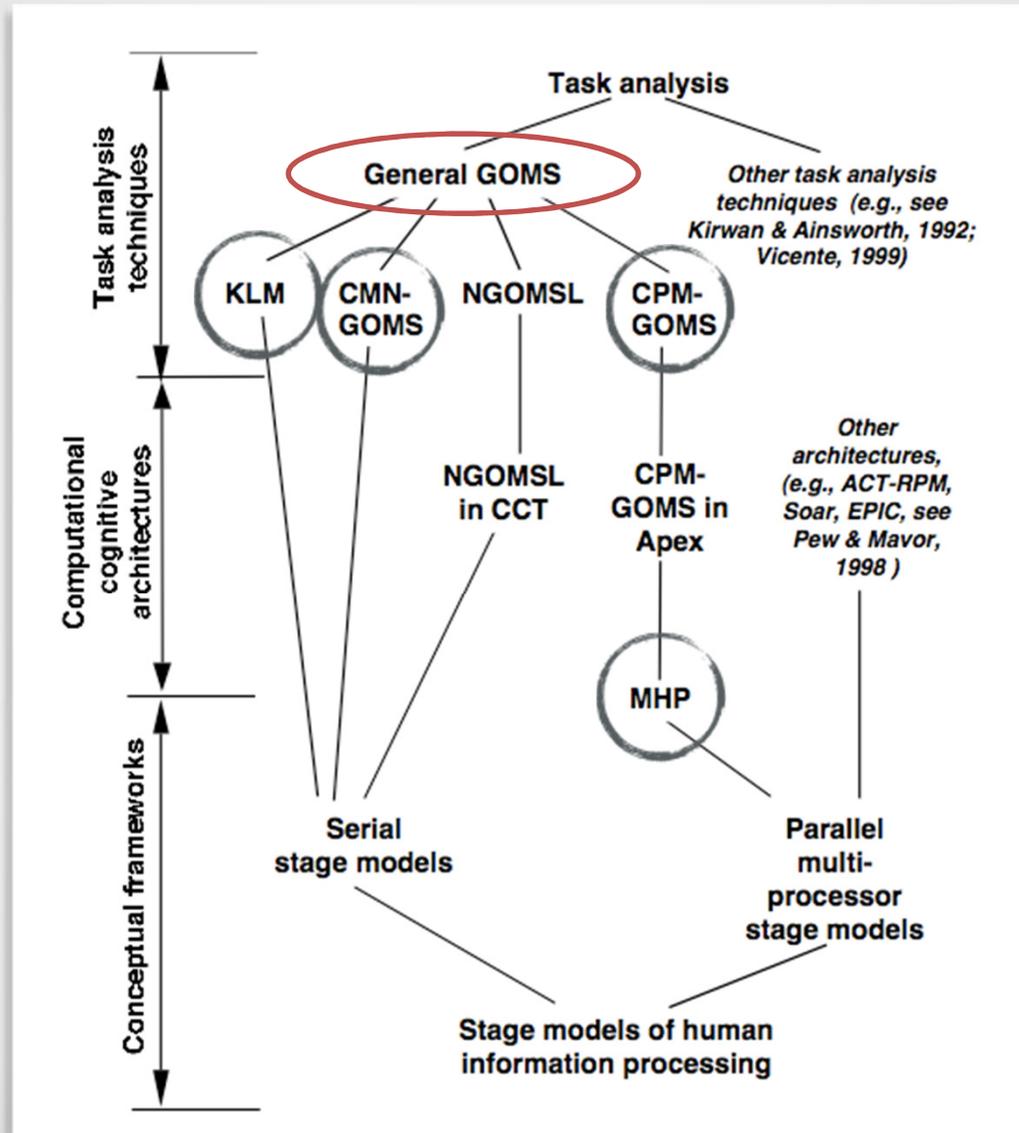
κ = Code type (physical, acoustic, visual, semantic)

τ = Cycle time

Questions?

**Can we model actual
interactions with an
interface?**

Taxonomy of Modeling



GOMS

Goals, **O**perators, **M**ethods, and **S**election

Goals – what the user wants to accomplish

Operators – The means that leads to a goal at a detailed level

Methods – Sequences of operators

Selection rules – Rules (general or personal) for choosing a certain method

What is a GOMS model?

A description of the knowledge that a user must have in order to carry out tasks on a device or a system

Composed of methods that are used to achieve specific **goals**

Methods are composed of operators at the lowest level

Operators are specific steps (gestures) that a user performs and are assigned a specific execution time

If a goal can be achieved by more than one method, then **selection rules** are used to determine the proper method.

GOMS Characteristics

Combines cognitive aspects with analysis of task

Quantitatively

Results in predictions of **time**

Qualitatively

GOMS can explain the predictions

Focus on methods to accomplish goals

When is GOMS analysis used?

Situations where users will be expected to perform tasks they have already mastered

Expert users

Routine work

When time is crucial

GOMS Example

Goal – edit an article

Operators – arrow keys, mouse, other keys

Method

Delete text (sub-goal)

Positioning: 1) arrow key 2) mouse

Marking: 1) double click 2) use mouse

Delete (and add text): 1) start writing 2) press delete then write new text

Selection rules – if close, use arrow key, etc.

CMN-GOMS

CMN = Card, Moran, & Newell who introduced GOMS to HCI

Operators are strictly sequential

Breadth-first until relevant level of detail, could be at a keystroke level

CMN-GOMS Example

GOAL: MOVE-TEXT		
• GOAL: CUT-TEXT		
• • GOAL: HIGHLIGHT-TEXT		
• • • [select*: GOAL: HIGHLIGHT-PHRASE-COMPOSED-OF-WORDS		
• • • • MOVE-CURSOR-TO-FIRST-WORD		1.10
• • • • DOUBLE-CLICK-MOUSE-BUTTON		0.40
• • • • MOVE-CURSOR-TO-LAST-WORD		1.10
• • • • SHIFT-CLICK-MOUSE-BUTTON		0.40
• • • • VERIFY-HIGHLIGHT		1.35
• • • GOAL: HIGHLIGHT-ARBITRARY-TEXT		
• • • • MOVE-CURSOR-TO-BEGINNING-OF-TEXT		
• • • • PRESS-MOUSE-BUTTON		
• • • • MOVE-CURSOR-TO-END-OF-TEXT		
• • • • RELEASE-CLICK-MOUSE-BUTTON		
• • • • VERIFY-HIGHLIGHT]		
• • GOAL: ISSUE-CUT-COMMAND		
• • • MOVE-CURSOR-TO-EDIT-MENU		1.10
• • • CLICK-MOUSE-BUTTON		0.20
• • • MOVE-CURSOR-TO-CUT-ITEM		1.10
• • • VERIFY-HIGHLIGHT		1.35
• • • CLICK-MOUSE-BUTTON		0.20
• GOAL: PASTE-TEXT		
• • GOAL: POSITION-CURSOR-AT-INSERTION-POINT		

Is all this feedback in order?

Issuing commands will be used a lot! can we shorten this procedure? Consider keyboard shortcuts.

CPM-GOMS

CPM = Cognitive Perceptual Motor or
Critical Path Method

Based on Model Human Processor, involving
parallel processing

Uses operators as in CMN-GOMS

Questions?

Keystroke Level Model (KLM)

Simpler of GOMS techniques, serial model

Uses duration estimates for keystroke-level operators

Quantitatively – predicts time for skilled users

Qualitatively – highlights new ideas

Keystroke Operators

The following is from Card, Moran and Newell (1983), The Psychology of Human-Computer Interaction, Lawrence Erlbaum, p. 264

Operator	Description and Remarks	Time (sec)
K	PRESS KEY OR BUTTON Pressing the SHIFT or CONTROL key counts as a separate K operation. Time varies with the typing skill of the user; the following shows the range of typical values: Best typist (135 wpm) .08 Good typist (90 wpm) .12 Average skilled typist (55 wpm) .20 Average non-secretary typist (40 wpm) .28 Typing random letters .50 Typing complex codes .75 Worst typist (unfamiliar with keyboard) 1.20	
P	POINT WITH MOUSE TO TARGET ON DISPLAY The time to point varies with distance and target size according to Fitts's Law, ranging from .8 to 1.5 sec, with 1.1 being average. This operator does not include the (.2 sec) button press that often follows. Mouse pointing time is also a good estimate for other efficient analogue pointing devices, such as joysticks (see Chapter 7).	1.10
H	HOME HAND(S) ON KEYBOARD OR OTHER DEVICE.	.40
D(n_D, l_D)	DRAW n_D STRAIGHT-LINE SEGMENTS OF TOTAL LENGTH l_D CM. This is a very restricted operator; it assumes that drawing is done with the mouse on a system that constrains all lines to fall on a square .56 cm grid. Users vary in their drawing skill; the time given is an average value.	$.9 n_D + .16 l_D$
M	MENTALLY PREPARE.	1.35
R(t)	RESPONSE BY SYSTEM.	t

Figure 8.1. The operators of the Keystroke-Level Model.

The K times are from Figure 2.14, except the .28 sec, which is the average typing rate of the non-secretarial users in Experiment 8A. The P time is from Chapter 7. The H time is from Chapter 5 and Chapter 7. The D time function and the coefficients were derived from least-squares fits on the drawing test data from the four MARHUP users. The time for M was estimated from the data in Experiment 8A.

K = key press

P = pointing

H = home hands

D = drawing a line

M = mental thinking

R_t = system response time

$T_{total} = K + P + H + D + M + R$

Operator Timings

Keying = 0.2 sec

The time it takes to tap a key on the keyboard

Pointing = 1.1 sec

The time it takes a user to point to a position on a display

Homing = 0.4 sec

The time it takes a user's hand to move from the keyboard to the GID or from the GID to the keyboard

Mentally Preparing = 1.35 sec

The time it takes a user to prepare mentally for the next step

Responding = based on task and system

The time a user must wait for a computer to respond to input

Building a KLM

List the overt actions necessary to do the task

Keystrokes and buttons (K)

Mouse movements (P)

Hand movements from keyboard to mouse (H)

System response time (R)

Mental operators (M) by CMN heuristics

Add up execution times

Let's try it out!

Temperature Converter

Choose which conversion is desired,
then type the temperature, and press Enter



Convert F to C



Convert C to F



Using KLM

Assume an average of four typed characters in an entered temperature, including any decimal point and sign

Assume (for simplicity) that typing is perfect; error detection and notification aren't needed

Temperature Converter

Choose which conversion is desired,
then type the temperature, and press Enter



Convert F to C



Convert C to F



K = key press

P = pointing

H = home hands

D = drawing a line

M = mental thinking

R_t = system response time

$T_{total} = K+P+H+D+M+R$

Inserting Mental Operators: Rule 0

Initial insertion of candidate Ms

Insert Ms in front of all keystrokes (K).

Insert Ms in front of all acts of pointing (P).

Do not insert Ms before any Ps that point to an argument.

In GUIs, mouse-operated widgets (buttons, check boxes, etc) are considered commands.

Text entry considered as an argument.

Arguments?

Pointing to a cell on a spreadsheet is pointing to an argument – no M

Pointing to a word in a manuscript is pointing to an argument – no M

Pointing to an icon on a toolbar is pointing to a command – M

Pointing to the label of a dropdown menu is pointing to a command -- M

Inserting Mental Operators: Rule 1

Deletion of anticipated Ms

If an operator following an M is fully anticipated in an operator immediately previous to that M, delete the M.

Inserting Mental Operators: Rule 2

If a string of MKs belongs to a cognitive unit, then delete all Ms except the first.

Example: If typing “100”, MKMKMK becomes MKKK

Inserting Mental Operators: Rule 3

Deletion of Ms before consecutive terminators

If a K is a redundant delimiter at the end of a cognitive unit, such as the delimiter of a command immediately following the delimiter of its argument, then delete the M in front of it.

Example: If coding in Java, ending a line with a “;” followed by a carriage return. The semi-colon is a terminator, and the carriage return is a redundant terminator, since both serve to end the line of code, thus, MKMK = MKK.

Inserting Mental Operators: Rule 4

Deletion of Ms that are terminators of commands

If K is a delimiter that follows a constant string, a command name (like “print”), or something that is the same every time you use it, then delete the M in front of it.

If a K terminates a variable string (e.g., name of file to be printed which is different each time), leave it in.

Inserting Mental Operators: Rule 5

Deletion of overlapped Ms

Do not count any portion of an M that overlaps an R – a delay, with the user waiting for a response from the computer

Questions?

CogTool

Assignment 3

<http://cogtool.com/>

Assignment posted on the website

Thursday: Using CogTool, bring a laptop if possible