First Presented for:

Google

Mountain View, CA 4/24/2006

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Why use $(\alpha 1(\mu 1\mu))$ when all you need are Crayons?

Background

The problem...

Application Usage Models tend to be either:

Rigorous

Time consuming

Mathematically intensive and/or complex

High degree of accuracy (when done well)

Requires empirical data

Typically overkill

Overly Simplistic

Quick

Little to no math needed

Occasionally accurate (generally by accident)

Ignores empirical data

There is very little in between to assist a modeler in an industry that desires rigor, but barely has time for simple!

State of the Practice...

In Practice:

Empirical data is uncommon

Complex math skills are rare

Time is not a luxury we often have

Every sub-team uses different modeling languages

Models are not often shared with or understood by other teams

Few modeling tools and methods are easily available

Most usage models are little more than "semi-educated" guesses

A lot of testing is based on application usage models

Rigorous Techniques to Model Application Usage

- Connie U. Smith, PhD. Performance Solutions: A Practical Guide to Creating Responsible, Scalable Software
- <u>Alberto Savoia</u> "Web Load Test Planning: Predicting how your Web site will respond to stress"
- <u>Daniel Menasce, PhD.</u> Capacity Planning for Web Performance: Metrics, Models and Methods & Scaling for E-Business
- J.D. Meier Improving .NET Application Performance and Scalability
- All require empirical data, two require advanced mathematics, none are intuitive to untrained



www.PerfTestPlus.com

"What sense does it make to measure with a laser, mark with chalk and cut with an axe?!?"

- Bob Barber, industrial arts teacher, middle school guidance counselor & my dad.

Summary

Rigorous approaches are frequently impractical

How much value does a model have if only one person understands it?

Why spend the time modeling if the resulting model isn't useful?

What the experts say

On Modeling...

"All models are wrong; some models are useful."

-George Box, Industrial Statistician.

Dr. Box is a Vilas Professor, the highest honor awarded to faculty by the University of Wisconsin. Dr. Box is concerned with the planning and analysis of industrial experiments. The object is to determine the important factors affecting product quality then adjust them to their best levels. Recent work has concentrated on reduction of variance, as well as adjustment of mean levels. New Bayesian methods of analysis have been devised for highly fractionated designs. Studies of reduction of variance transmissions are in progress.

http://www.engr.wisc.edu/ie/faculty/box_george.html

On Visualization...

"Visual representations of evidence should be governed by principles of reasoning about quantitative evidence. Clear and precise seeing becomes as one with clear and precise thinking."

-Edward Tufte, data visualization expert.

Edward Tufte has written seven books, including *Visual Explanations, Envisioning Information, The Visual Display of Quantitative Information*, and *Data Analysis for Politics and Policy*. He writes, designs, and self-publishes his books on information design, which have received more than 40 awards for content and design. He is Professor Emeritus at Yale University, where he taught courses in statistical evidence, information design, and interface design. His current work includes digital video, sculpture, printmaking, and a new book *Beautiful Evidence*.

http://www.edwardtufte.com

On Application Usage Models...

- "If... your simulated load is realistic and you can draw useful conclusions. If not, you are wasting your time and money."
- Alberto Savoia, CTO Agitar, Inc (Former Engineering Executive of Google)

Before Agitar, Alberto worked at Google as the engineering executive in charge of the highly successful and profitable ads group. In October 1998, he cofounded and became CTO of Velogic Inc., the pioneer and leading innovator in Internet performance and scalability testing. Velogic was acquired in 2000 by Keynote Systems Inc. (NASD:KEYN), where Alberto continued to serve as chief technologist. Prior to Velogic, Alberto had an impressive 13-year career at Sun Microsystems. His last position at Sun was general manager of SunTest, a highly successful business unit he created and established as the technology and market leader in Java testing solutions. Before SunTest, he served Sun as director of the software technology research group for Sun Microsystems Laboratories, where his staff developed mission-critical and groundbreaking new technology in the areas of software development environments, programming languages, and clustering.

http://www.agitar.com

Summary

Models need to be useful

A (good) picture is worth a thousand words

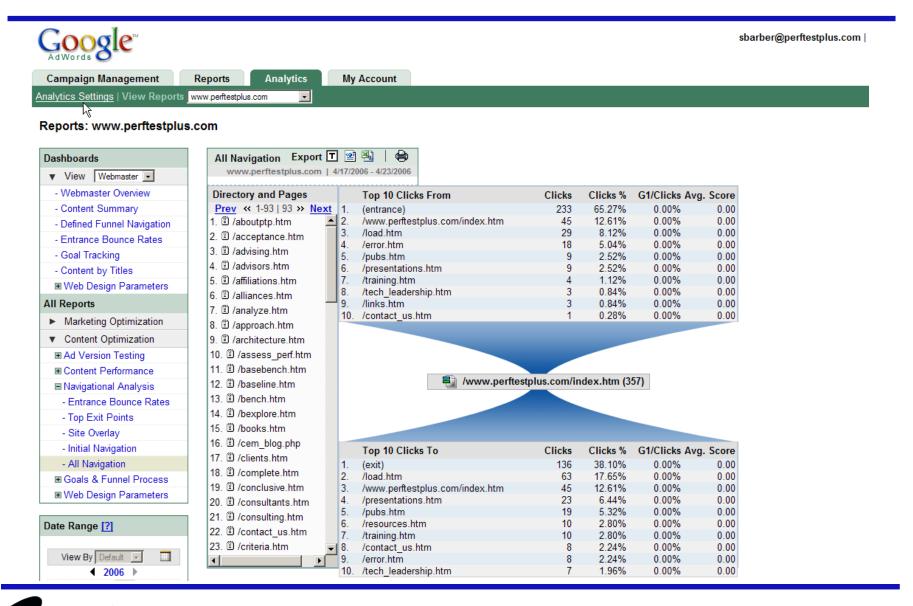
Inaccurate models lead to wasted time and money

Usage models we are (unfortunately) used to seeing

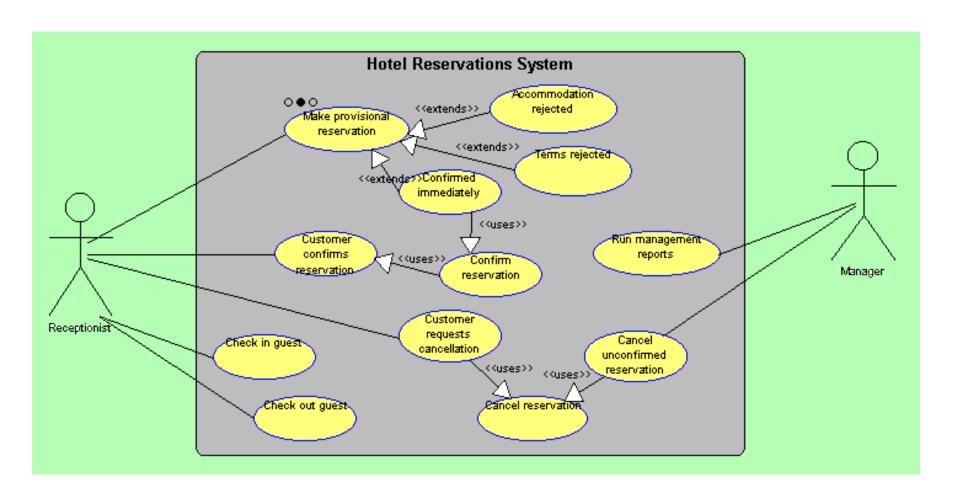
Logs from Technical Administrators

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217.155.205.16 - - [24/Apr/2006:00:09:48 +0300] "GET /favicon.ico HTTP/1.1" 200 1123 "-" "Mozilla/5.0 (Windows; U; Windows NT 5.1; en-GB; nv:1.8.0.2) Gecko/20060308 Firefox/1.5.0.2"
217.155.205.16 -- [24/Apr/2006:00:09:48 +0300] "GET /styles/base.css HTTP/1.1" 200 1479 "http://www.perftestplus.com/" "Mozilla/5.0 (Windows; U; Windows NT 5.1; en-GB; rv:1.8.0.2) Gecko/20060308 Firefox/1.5.0.2"
217.155.205.16 -- [24/Apr/2006:00:09:48 +0300] "GET /dd/dd_script.js HTTP/1.1" 200 2599 "http://www.perftestplus.com/" "Mozilla/5.0 (Windows; U; Windows NT 5.1; en-GB; rv:1.8.0.2) Gecko/20060308 Firefox/1.5.0.2"
217.155.205.16 - - [24/Apr/2006:00:09:49 +0300] "GET /dd/mm menu.is HTTP/1.1" 200 29998 "http://www.perftestplus.com/" "Mozilla/5.0 (Windows; U; Windows NT 5.1; en-GB; rv:1.8.0.2) Gecko/20060308 Firefax/1.5.0.2"
217.155.205.16 - - [24/Apr/2006:00:09:50 +0300] "GET /dd/logo.gif HTTP/1.1" 200 4193 "http://www.perftestplus.com/" "Mazilla/5.0 (Windows; U; Windows NT 5.1; en-GB; rv:1.8.0.2) Gecko/20060308 Firefox/1.5.0.2"
217.155.205.16 - - [24/Apr/2006:00:09:50 +0300] "GET /dd/slogan.gif HTTP/1.1" 200 4858 "http://www.perftestplus.com/" "Mazilla/5.0 (Windows; U; Windows NT 5.1; en-GB; rv:1.8.0.2) Gecko/20060308 Firefax/1.5.0.2"
217.155.205.16 - - [24/Apr/2006:00:09:51 +0300] "GET /dd/home.qif HTTP/1.1" 200 1226 "http://www.perftestplus.com/" "Mozilla/5.0 (Windows; U; Windows NT 5.1; en-GB; rv:1.8.0.2) Gecko/20060308 Firefox/1.5.0.2"
217.155.205.16 - - [24/Apr/2006:00:09:51 +0300] "GET /dd/about_us.gif HTTP/1.1" 200 1265 "http://www.perftestplus.com/" "Mazilla/5.0 (Windows; U; Windows NT 5.1; en-GB; rv:1.8.0.2) Gecko/20060308 Firefax/1.5.0.2"
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217.155.205.16 - - [24/Apr/2006:00:09:51 +0300] "GET /dd/resources.gif HTTP/1.1" 200 1144 "http://www.perftestplus.com/" "Mozilla/5.0 (Windows; U; Windows NT 5.1; en-GB; ry:1.8.0.2) Gecko/20060308 Firefax/1.5.0.2"
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130.13.4.174 - - [24/Apr/2006:00:09:55 +0300] "GET / HTTP/1.1" 200 9730 "-" "Mozilla/4.0 (compatible; MSIE 6.0; Windows NT 5.1; SV1; .NET CLR 1.1.4322)"
130.13.4.174 - - [24/Apr/2006:00:09:55 +0300] "GET /dd/dd script.js HTTP/1.1" 200 2599 "http://www.perftestplus.com/" "Mazilla/4.0 (compatible; MSIE 6.0; Windows NT 5.1; SV1; .NET CLR 1.1.4322)"
130.13.4.174 - - [24/Apr/2006:00:09:55 +0300] "GET/styles/base.css HTTP/1.1" 200 1479 "http://www.perftestplus.com/" "Mozilla/4.0 (compatible; MSIE 6.0; Windows NT 5.1; SV1; .NET CLR 1.1.4322)"
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130.13.4.174 - - [24/Apr/2006:00:09:56 +0300] "GET /dd/logo.gif HTTP/1.1" 200 4193 "http://www.perflestplus.com/" "Mozilla/4.0 (compatible; MSIE 6.0; Windows NT 5.1; SV1; .NET CLR 1.1.4322)"
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130.13.4.174 - - [24/Apr/2006:00:09:56 +0300] "GET /dd/home.gif HTTP/1.1" 200 1226 "http://www.perftestplus.com/" "Mozilla/4.0 (compatible; MSIE 6.0; Windows NT 5.1; SV1; .NET CLR 1.1.4322)"
130.13.4.174 -- [24/Apr/2006:00:09:56 +0300] "GET /dd/about_us.gif HTTP/1.1" 200 1265 "http://www.perftestplus.com/" "Mozilla/4.0 (compatible; MSIE 6.0; Windows NT 5.1; SV1; .NET CLR 1.1.4322)"
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130.13.4.174 - - [24/Apr/2006:00:09:56 +0300] "GET /dd/resources.gif HTTP/1.1" 200 1144 "http://www.perftestplus.com/" "Mozilla/4.0 (compatible: MSIE 6.0: Windows NT 5.1: SV1: .NET CLR 1.1.4322)"
130.13.4.174 - - [24/Apr/2006:00:09:56 +0300] "GET /dd/old_stuff.gif HTTP/1.1" 200 529 "http://www.perftestplus.com/" "Mozilla/4.0 (compatible; MSIE 6.0; Windows NT 5.1; SV1; .NET CLR 1.1.4322)"
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217.155.205.16 - - [24/Apr/2006:00:10:24 +0300] "GET /contact us.htm HTTP/1.1" 200 6144 "http://www.perftestplus.com/aboutptp.htm" "Mozilla/5.0 (Windows; U; Windows NT 5.1; en-GB; rv:1.8.0.2) Gecko/20060308 Firef
130.13.4.174 - - [24/Apr/2006:00:10:53 +0300] "GET /load.htm HTTP/1.1" 200 6658 "http://www.perftestplus.com/" "Mozilla/4.0 (compatible; MSIE 6.0; Windows NT 5.1; SV1; .NET CLR 1.1.4322)"
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130.13.4.174 - - [24/Apr/2006:00:10:53 +0300] "GET /img/250.JPG HTTP/1.1" 200 717 "http://www.perftestplus.com/load.htm" "Mozilla/4.0 (compatible; MSIE 6.0; Windows NT 5.1; SV1; .NET CLR 1.1.4322)"
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65.241.148.2 - - [24/Apr/2006:00:14:28 +0300] "GET /dd/dd_script.js HTTP/1.1" 304 - "http://www.perftestplus.com/" "Mozilla/4.0 (compatible; MSIE 7.0; Windows NT 5.1; SV1; .NET CLR 1.1.4322; .NET CLR 2.0.50727; Ale:
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65.241.148.2 - - [24/Apr/2006:00:14:30 +0300] "GET /dd/logo, aif HTTP/1.1" 304 - "http://www.perftes/blus.com/" "Mozilla/4.0 (compatible: MSIE 7.0; Windows NT 5.1; SV1: .NET CLR 1.1.4322: .NET CLR 2.0.50727; Alexa T
65.241.148.2 - - [24/Apr/2006:00:14:30 +0300] "GET /dd/slogan.gif HTTP/1.1" 304 - "http://www.perftestplus.com/" "Mczilla/4.0 (compatible; MSIE 7.0; Windows NT 5.1; SV1; .NET CLR 1.1.4322; .NET CLR 2.0.50727; Alexa
65.241.148.2 - - [24/Apr/2006:00:14:30 +0300] "GET /dd/home.gif HTTP/1.1" 304 - "http://www.perftestplus.com/" "Mozilla/4.0 (compatible; MSIE 7.0; Windows NT 5.1; SV1; .NET CLR 1.1.4322; .NET CLR 2.0.50727; Alexa
65.241.148.2 - - [24/Apr/2006:00:14:30 +0300] "GET/dd/about us.gif HTTP/1.1" 304 - "http://www.perftestplus.com/" "Mozilla/4.0 (compatible; MSIE 7.0; Windows NT 5.1; SV1; .NET CLR 1.1.4322; .NET CLR 2.0.50727; Ake
65.241.148.2 - - [24/Apr/2006:00:14:31 +0300] "GET /dd/services, aif HTTP/1.1" 304 - "http://www.perftestplus.com/" "Mozilla/4.0 (compatible: MSIE 7.0: Windows NT 5.1; SV1: .NET CLR 1.1.4322: .NET CLR 2.0.50727: Ale:
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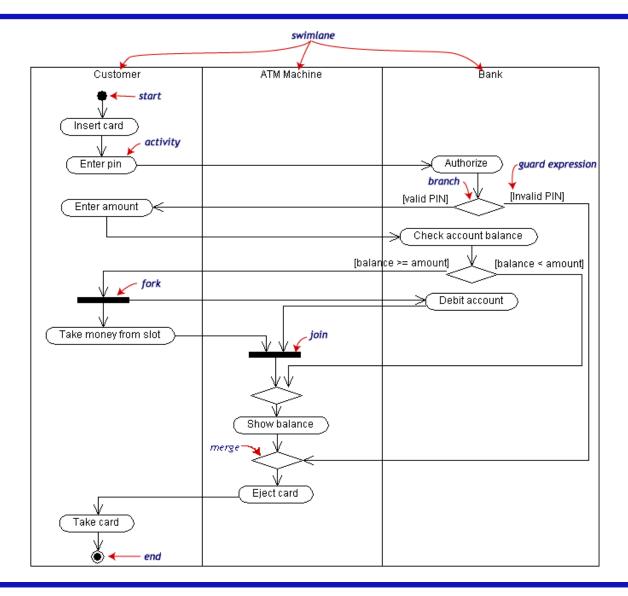
Parsed Logs from Less Technical Administrators



UML from Analysts



State Transition Models from Developers



Words from Managers and Marketers

"Process Model

All content submitted into the CMS will automatically follow the appropriate workflow in MyTool. A variety of workflows can be generated to mandate the path of information based on the type of data, the role of the creator, and the location within the site. Content providers will be empowered to make changes through the pre-formatted templates that they can access through a standard Web browser. The templates clearly separate the design elements of the site from the text and editable portions. Content providers can edit and submit their changes for approval via an automated workflow cycle, which circulates the proposed changes to authorized reviewers for approval or edits. Once this cycle is complete, the changes can be automatically posted to the site. This reduces the need for the Web team to be involved in every site change..."

Complex Mathematics from Academics

This relationship is called the Service Demand Law, which can also be written as $D_i = V_i \times S_i$, by definition of the service demand (and since $D_i = U_i/X_0 = (B_i/T)/(C_0/T) = B_i/C_0 = (C_i \times S_i)/C_0 = (C_i/C_0) \times S_i = V_i \times S_i$). In many cases, it is not easy to obtain the individual values of the visit counts and service times. However, Eq. (3.2.3) indicates that the service demand can be computed directly from the device utilization and system throughput. The multiclass version of the Service Demand Law is $D_{i,r} = U_{i,r}/X_{0,r} = V_{i,r} \times S_{i,r}$

Example 3.3.

A Web server is monitored for 10 minutes and its CPU is observed to be busy 90% of the monitoring period. The Web server log reveals that 30,000 requests are processed in that interval. What is the CPU service demand of requests to the Web server?

The observation period T is 600 (= 10 × 60) seconds. The Web server throughput, X_0 , is equal to the number of completed requests C_0 divided by the observation interval; X_0 = 30,000/600 = 50 requests/sec. The CPU utilization is $U_{\rm CPU}$ = 0.9. Thus, the service demand at the CPU is $D_{\rm CPU}$ = $U_{\rm CPU}/X_0$ = 0.9/50 = 0.018 seconds/request. •

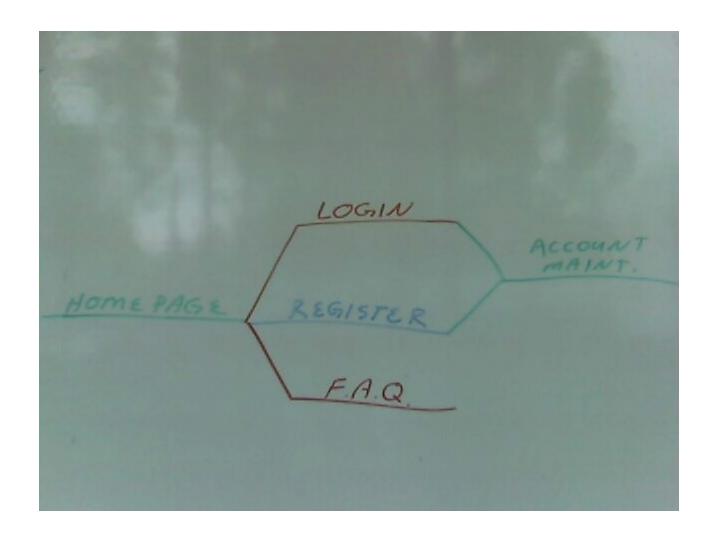
Summary

Cross-team communication is, at best, inefficient
Everyone has many modeling techniques to master
Important information is often lost in translation
Teams argue about adherence to modeling standards
None of these models are immediately intuitive

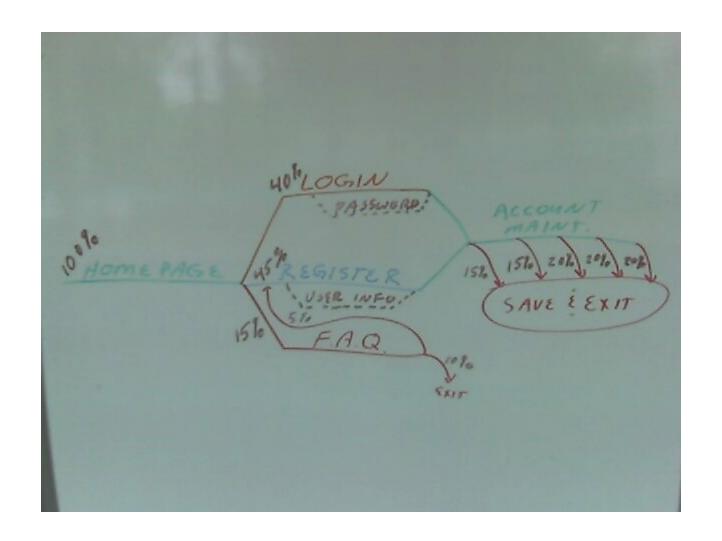
There has *GOT* to be a better approach!!

Something that may be better

A Visual Model of Application Usage



A Visual Model of Application Usage



A Whiteboard Accident

We started using it and named it UCMLTM...

Value:

Visually depict system with multiple usage paths and/or users.

Document system usage and associated parameters.

Easier to create than many other methods.

Intuitively understood by all members of the team.

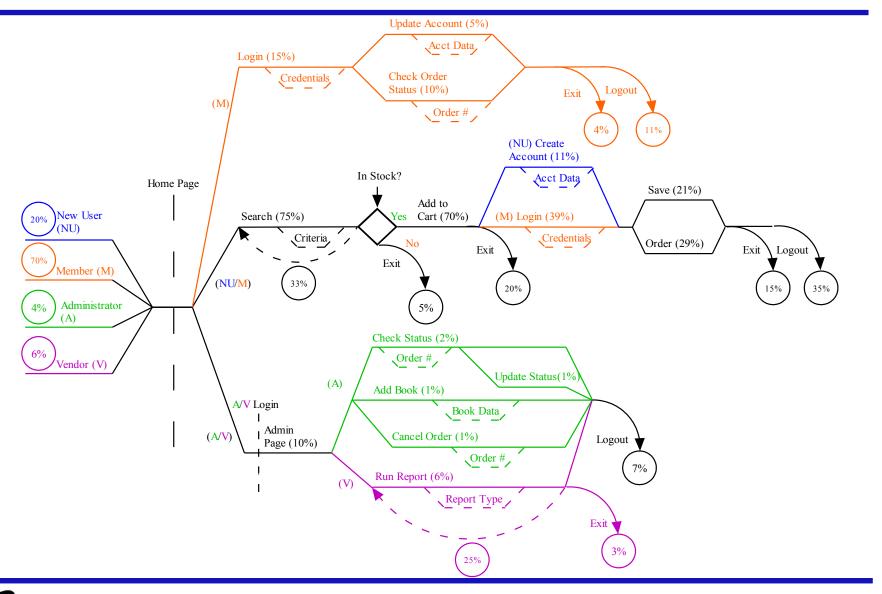
Is a modeling framework, not a standard.

Gives team a common language to discuss usage models.

Can be done with paper, whiteboards, graphics tools or...



A Visual Model of Application Usage



Summary

Sometimes simple gets us further, faster

Being able to use the same medium to talk to everyone from user through developer to academic often yields better models

Simple may not replace other models, but rather feed into them or supplement them

Sometimes, a lack of standards are more unifying than rigid standards

Whiteboards are easier to use for multi-user collaboration than projectors

We could always use another excuse to use...

Summary



Where to go for more Information

George Box http://www.engr.wisc.edu/ie/faculty/box_george.html

Edward Tufte http://www.edwardtufte.com

Alberto Savoia http://www.agitar.com

Connie Smith http://www.perfeng.com/

Daniel Menasce http://cs.gmu.edu/faculty/menasce.html

J.D. Meir http://msdn.microsoft.com/library/default.asp?url=/library/en-us/dnpag/html/scalenet.asp

Questions



Contact Info

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