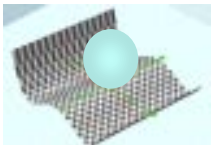
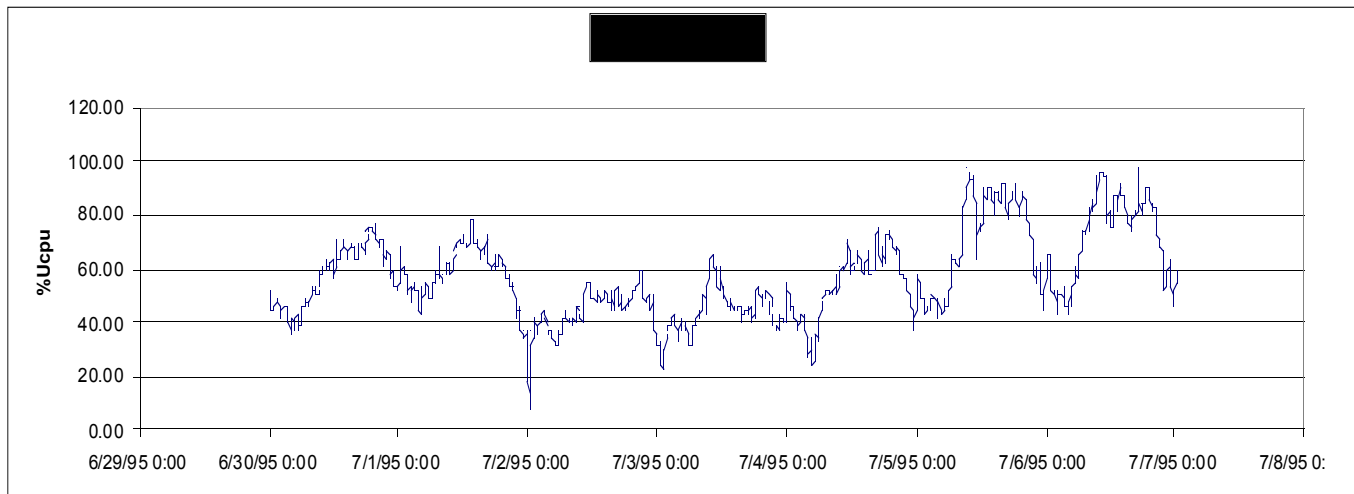


How to Assess Web Server Growth

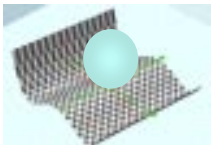


Website Capacity Planning

- **Is capacity *planning* just a web oxymoron?**
- **Abundantly clear that capacity is needed**
- **But can the upgrade points be scheduled?**
- **We'll pull two rabbits out of the hat:**
 - **Short-term demand**
 - **Long-term growth**

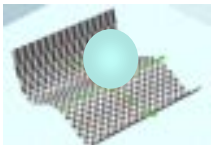


Database Server



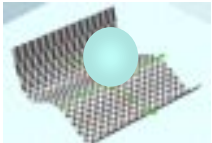
Statistical Models

- **Useful for finding trends in raw performance data**
- **Trends can be used to predict growth**
- **Methods include:**
 - **Regression**
 - **time-independent data**
 - **Time Series Analysis**
 - **correlated in time**
 - **ANOVA: Analysis Of Variance**
 - **useful for quantifying the degree of interaction between otherwise random performance metrics**



Why EXCEL?

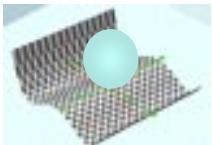
- **Ubiquitous**
 - Many desktops run MS Office
 - Internet news groups for EXCEL/VBA help
- **Programmable**
 - VBA, object-oriented, debugging, journaling, good prototyping tool
- **Data filtering**
 - Need to internally select different data according to specified criteria
- **Statistical analysis functions (Regression, ANOVA, ARIMA)**
 - Didn't know which ones would be needed to analyze this data
- **Charts**
 - Plotting is integrated with data and has a VBA programmable interface
- **Printing**
 - Single push-button
 - Can optionally publish HTML pages
- **Limitations**
 - I had not programmed in VBA before
 - Dummy variables are a pain!
 - Saving data and charts requires keeping separate workbooks



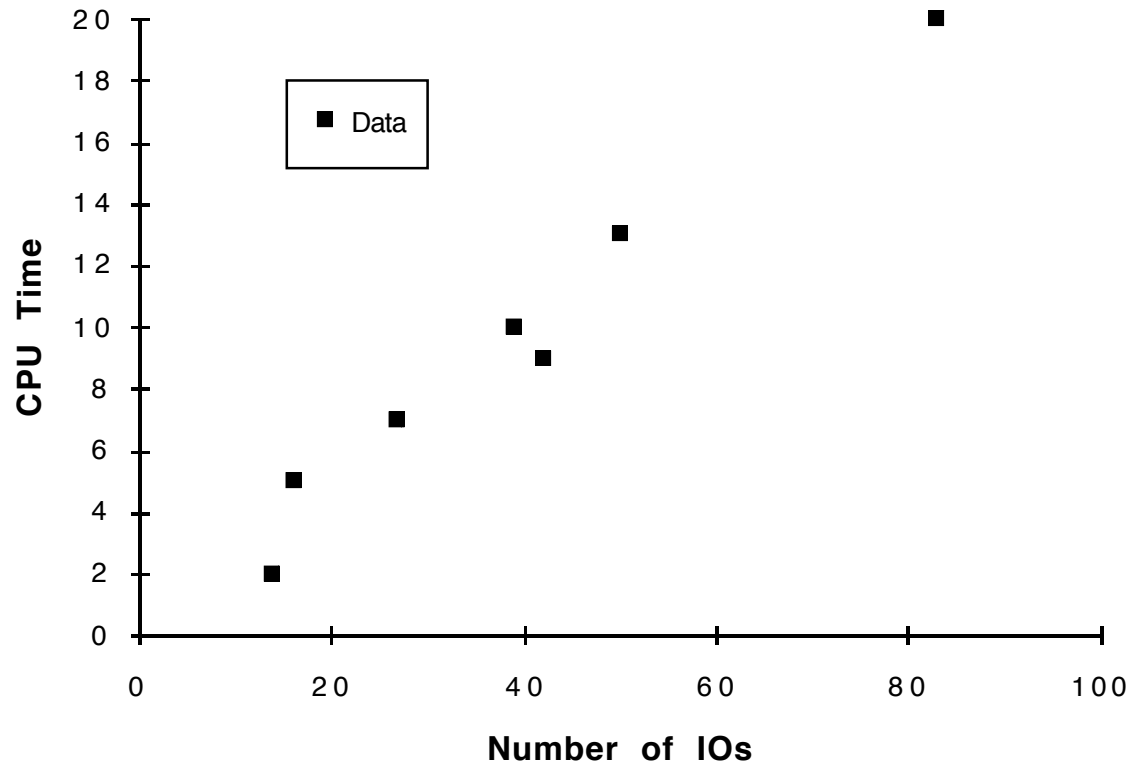
Statistical Performance Toy

- **Collected performance data**
- **Total number of IOs issues**
- **Cumulative CPU time**

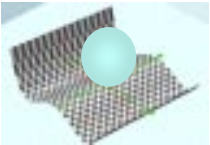
Total IOs	CPU Time
14	2
16	5
27	7
42	9
39	10
50	13
83	20



Scatter Plot



Looks like a linear relationship, but is it?

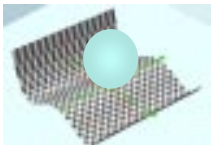


EXCEL Regression Tool

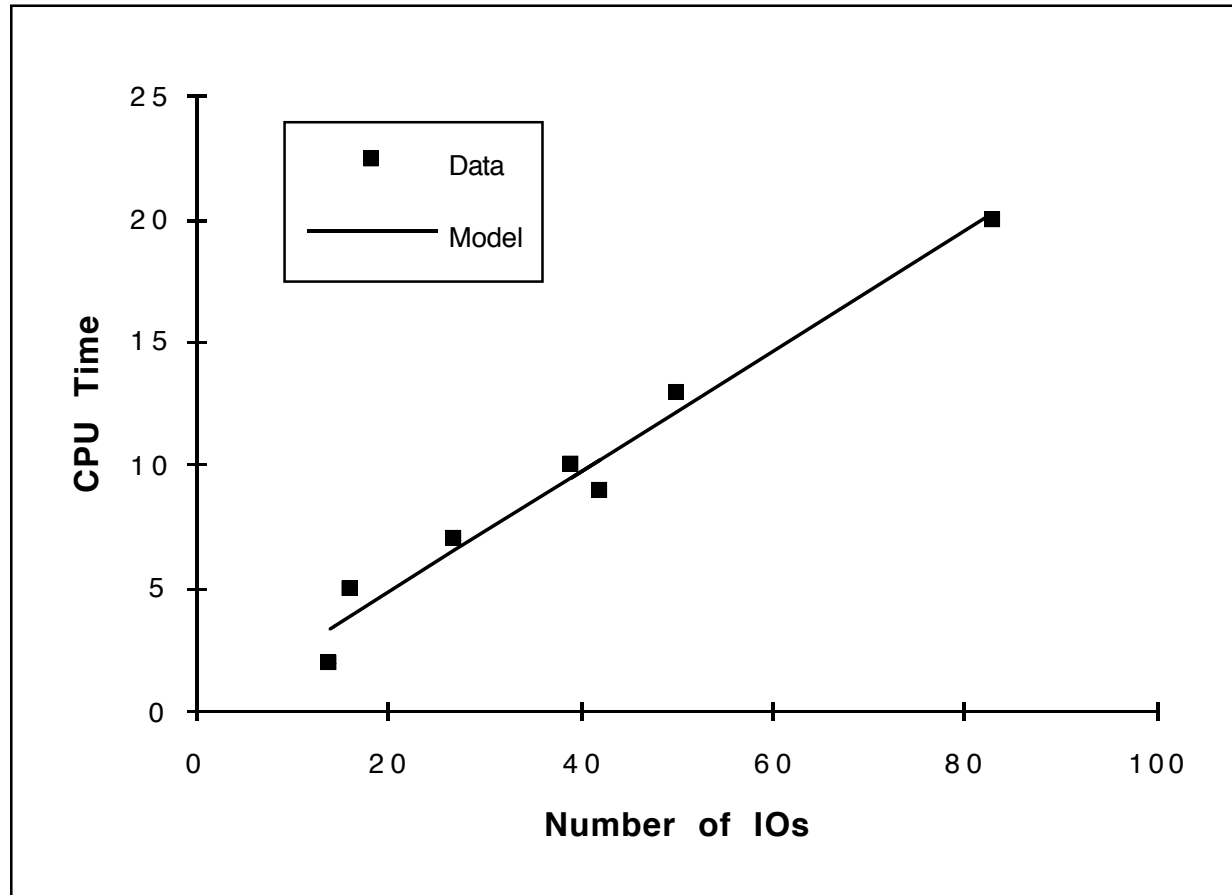
<i>Regression Statistics</i>							
Multiple R	0.98563213						
R Square	0.9714707						
	0.96576484						
	1.08340978						
Observations	7						
<i>Analysis of Variance</i>							
		<i>df</i>		<i>Mean Square</i>	<i>F</i>	<i>Significance F</i>	
Regression		1	199.845402	199.845402	170.258442	4.7161E-05	
Residual		5	5.86888379	1.17377676			
Total		6	205.714286				
<i>Coefficients</i>							
				<i>t Statistic</i>	<i>P-value</i>	<i>Lower 95%</i>	<i>Upper 95%</i>
Intercept	-0.0082824	0.831105	-0.0099655	0.99237191	-2.1447023	2.12813755	
x1	0.24375637	0.01868107	13.0483118	1.2488E-05	0.19573524	0.2917775	

Linear model: $y = mx + c$

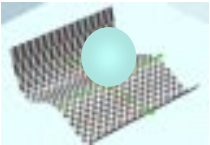
CPUtime = 0.24375637 (IOs) – 0.0082824



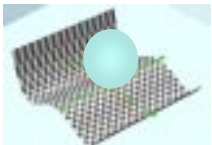
Linear Regression Model



Use linear model to project IO and CPU capacity

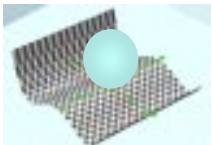


Multivariate Linear Regression

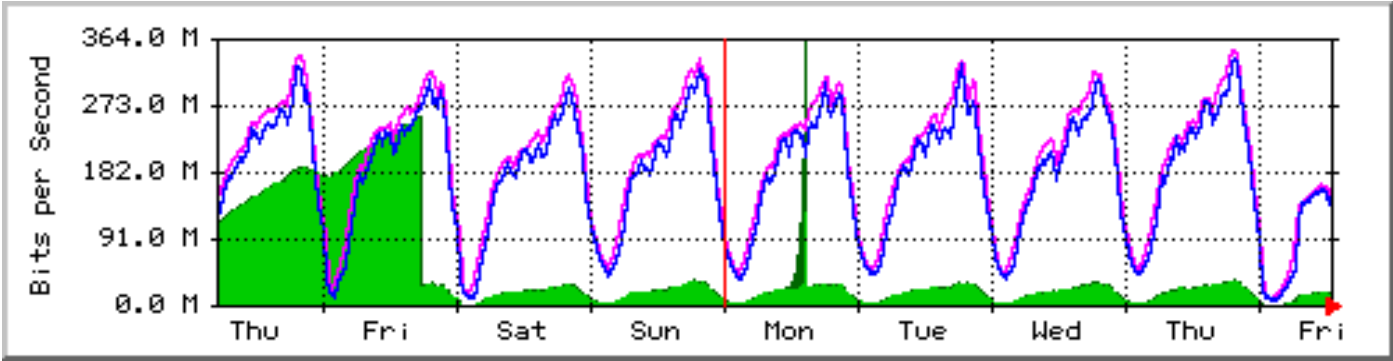


Web Server Weekly Data

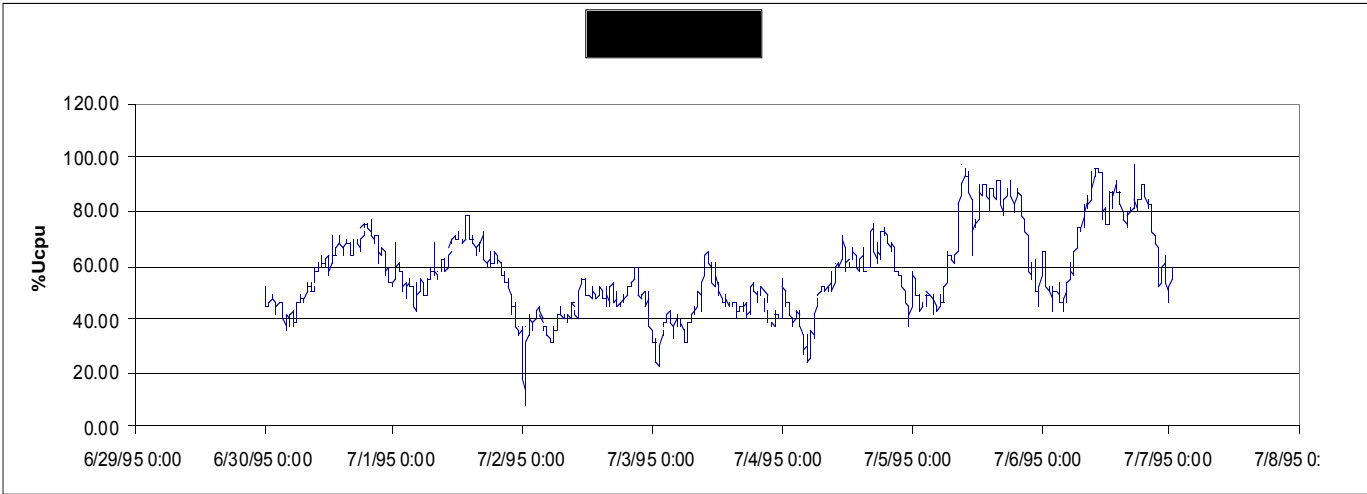
- **Analyzed 10 weeks of data from 7/1/99 to 9/6/99**
- **Resorted to *SE Percolator* data (2 min samples)**
- **First 2 weeks (until 7/15) show Server > 160% busy**
 - At least 60% more capacity being demanded than was available
 - Many upgrades (e.g., CPUs, ORACLE, Apps) from 7/15 to 7/31
- **Only the last 5 weeks of data are stable enough to show consistent trending information**



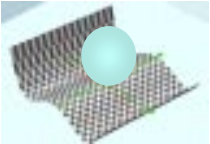
Daily Data



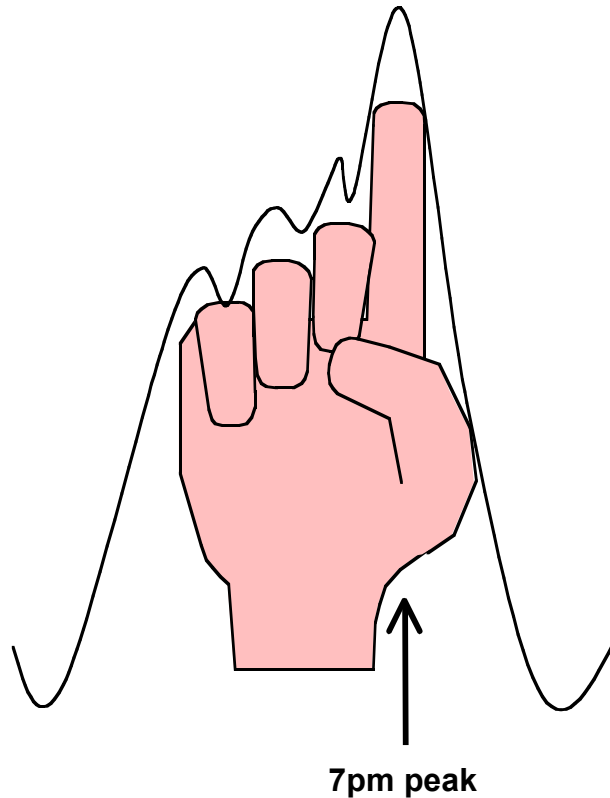
Network



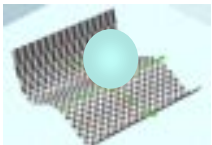
Database Server



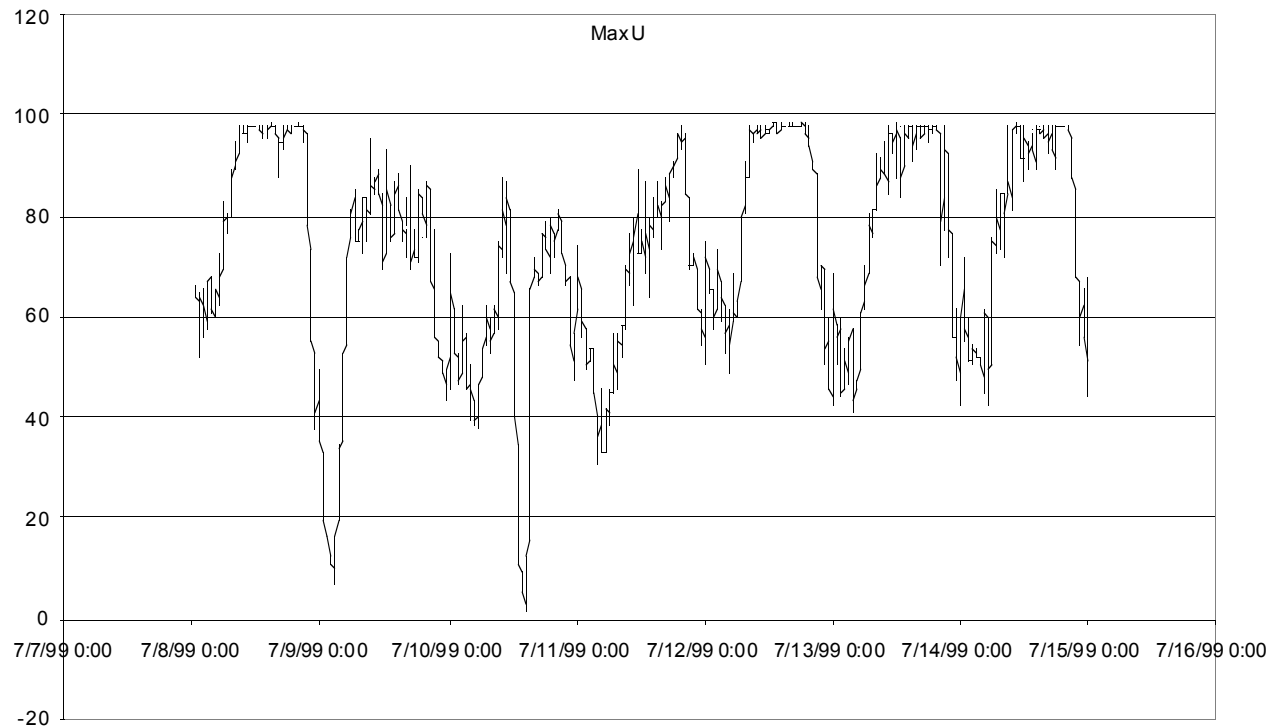
Numero Uno Signature



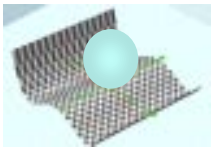
- **Renditions of this load characteristic seen on all major website systems.**
- **Servers are more likely to be throttled than networks.**



Raw Data with Saturation

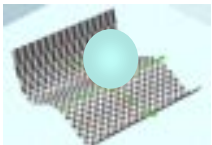


Fingers are “amputated” above a measured CPU utilization of 100%

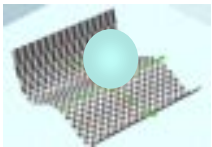
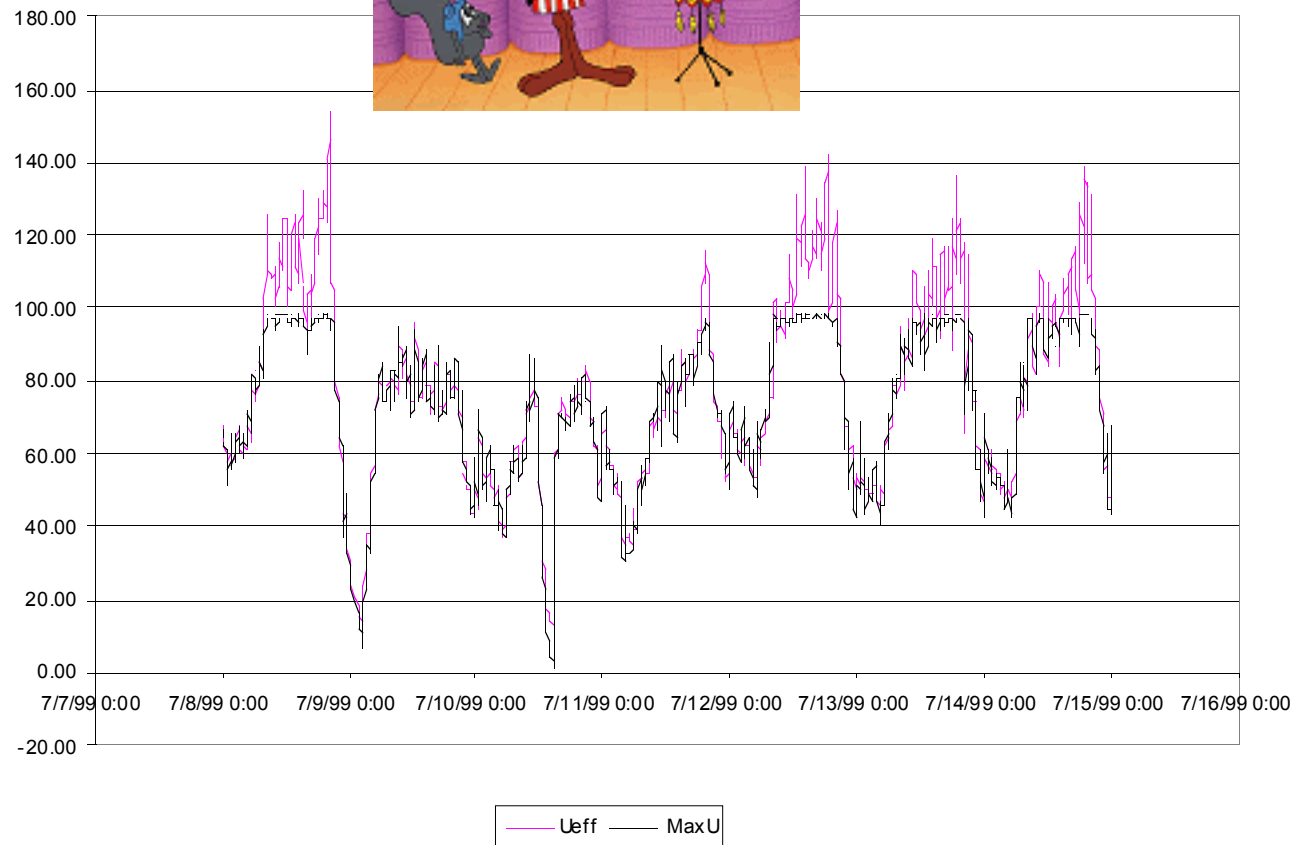


Effective Demand

- **Would like to be able to predict what the “fingers” look like when they can’t be seen in the CPU utilization data.**
- **We can do this with a multivariate statistical model.**
- **This is our first ‘rabbit’ !!**

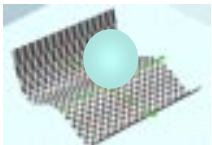


Predicted Signature



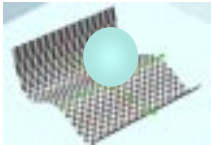
Capacity Metrics

- **Typical websites collect *cubic light-years* of performance data daily**
- **But what is the data trying to tell us?**
- **Raw data is like raw building material**
- **To build a building, you need a **blueprint****
- **A performance *model* acts like a **blueprint****
- **Prototype capacity model built was in EXCEL/VBA**



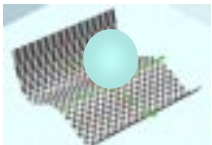
Long Term Web Capacity

Nonlinear Regression



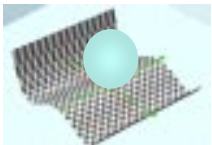
E10K@333 MHz Headroom

- **Current 52-way peaking around 95% utilized**
- **Peak to Avg. Ucpu ratio ~ 1.3**
- **Predicts that peak utilization will consistently hit 100% by end of Sept '99**
- **This is not necessarily bad**
- **But beware the SMP Wall!**



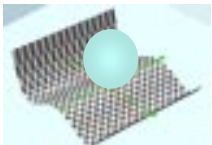
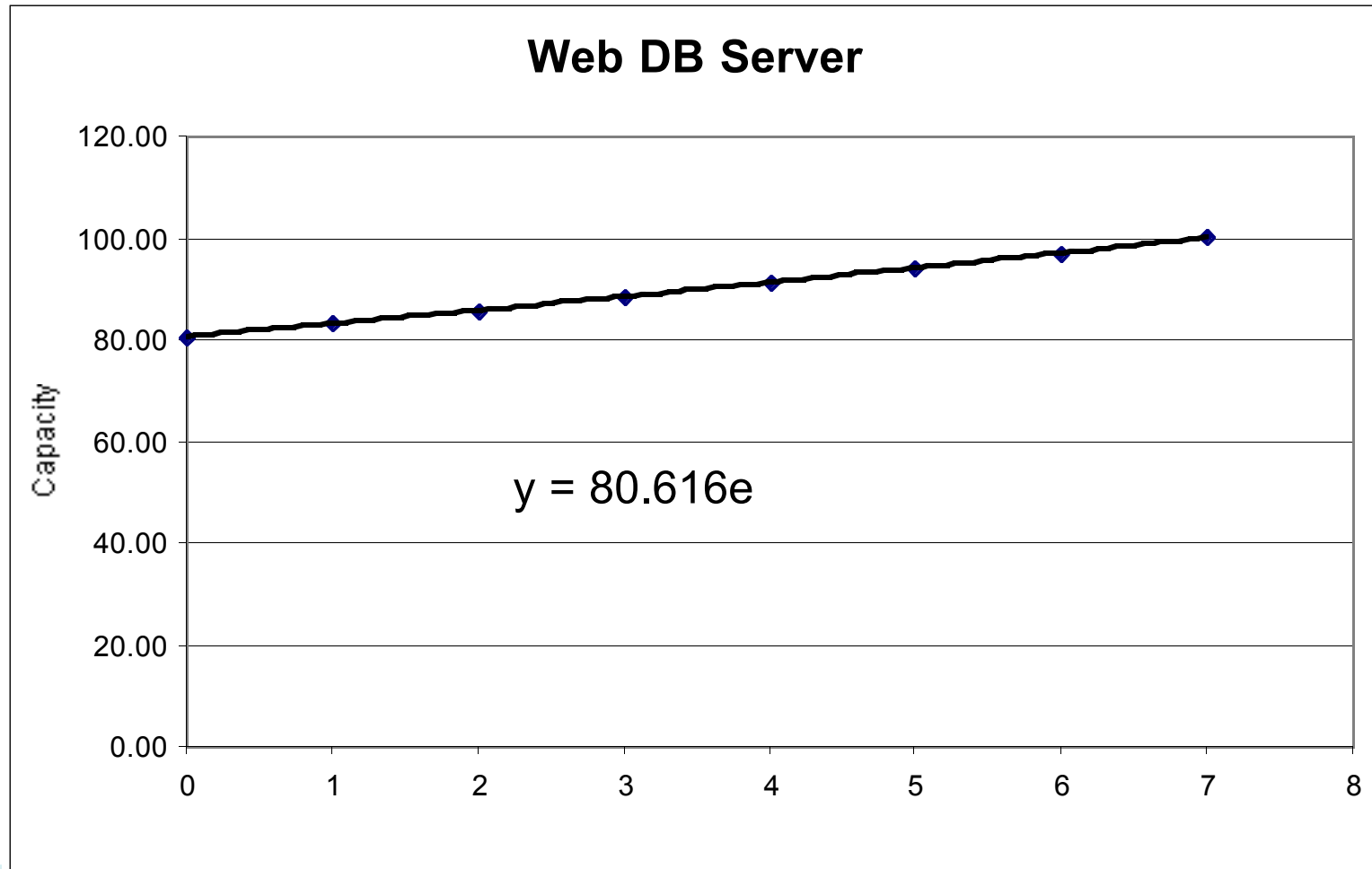
Server Growth Model

- **Expect server capacity consumption to exceed simple linear growth. As is evident in:**
 - **Business growth expectations (you want this!)**
 - **Network bandwidth measurements (MRTG)**
- **Compounding or *exponential* model**
- **Only a single parameter i.e., *growth rate***
- **Use EXCEL trending facility**



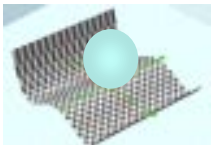
Initial Fit to Data

$$C(W) = 80.62 e^{0.0309W}$$

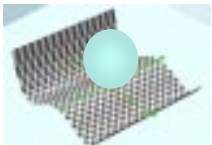
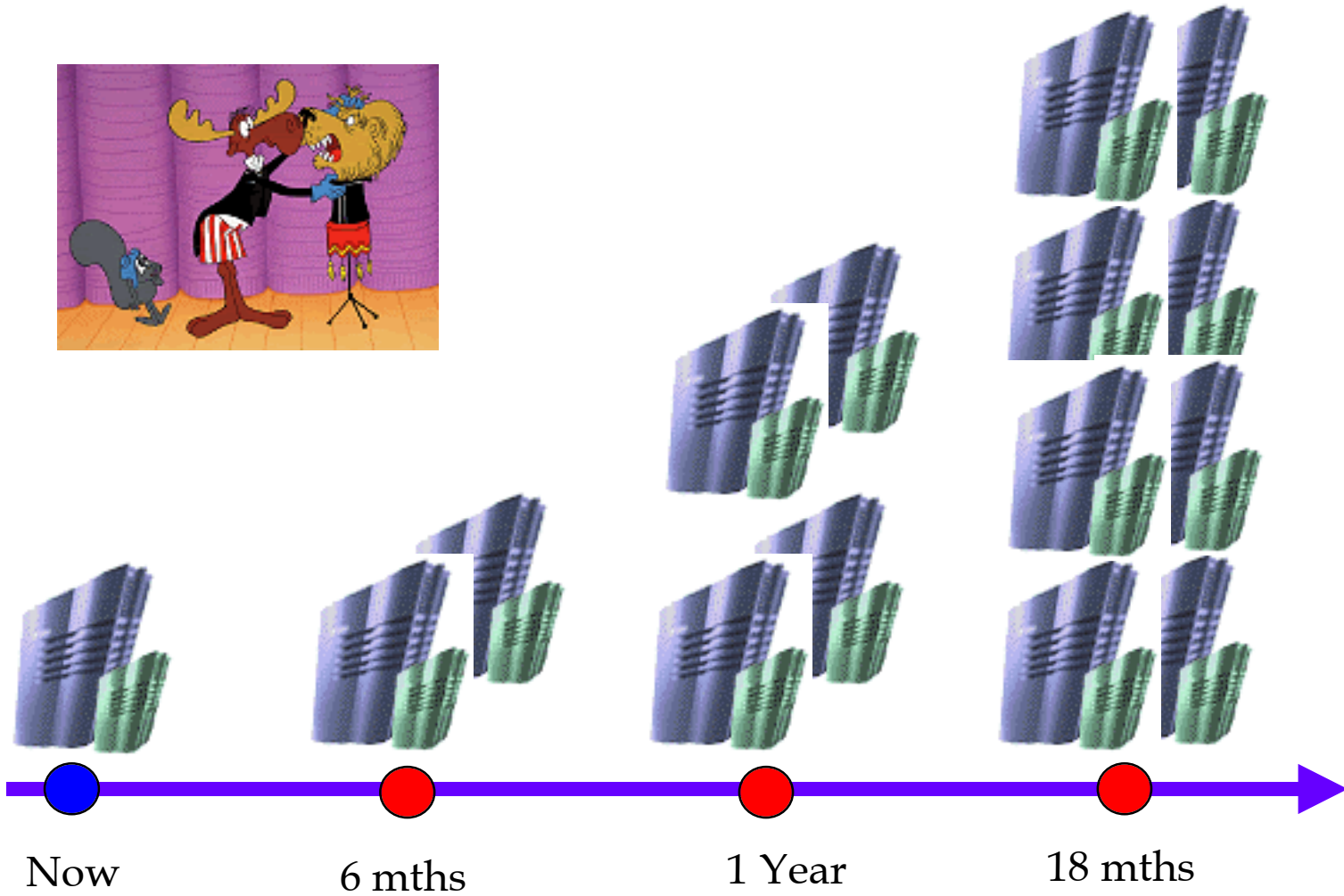


Growth Rate

- **Fit to 7 weeks(W) of effective demand data**
- **Web DB server growth rate = 0.0309**
- **Doubles ea. $\text{Log}(2)/0.0309 = 5.6$ months !!**
- **10 times faster than DP workloads**
- **4 times faster than Moore's Law**
- **Agrees with other data at this website**
- **This is our second 'rabbit' !!!**

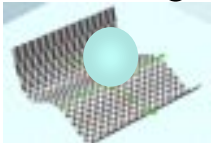


Server Bankruptcy



More Realistic Scaling

- **Uses super-serial scaling model (PPA Chap. 6)**
- **SS model has 2-parameters:**
 - **Serial contention (σ)** e.g., mutex locks
 - **Coherency (λ)** e.g., cache fetch (rolloff factor)
- **64-way@400MHz M-values fit to SS model**
 - **Contention: $\sigma = 0.0061$** (half a percent)
 - **Coherency: $\lambda = 0.0016$** (a fifth of 1 percent)
- **64-way@400MHz typical ORACLE data**
 - **Contention: $\sigma = 0.030$** (about 3%)
 - **Coherency: $\lambda = 0.002$** (assume this doesn't change)
- **Recalculate M-values using SS parameters**
- **Reduces headroom estimates**
- **Shortens the procurement mileposts**



Server CPU Upgrades: II

- **Upgrade paths:**

- 1 **Add more CPUs (52- to 64-way @ 333 MHz + 4MB cache)**

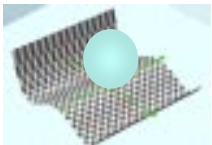
- **Expect 6% headroom gain (cf. 15% previously)**

- 2 **Faster CPUs (333 to 400 MHz) in a 52-way config**

- **Expect 32% headroom gained (same)**

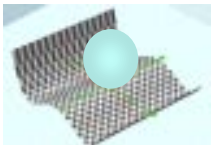
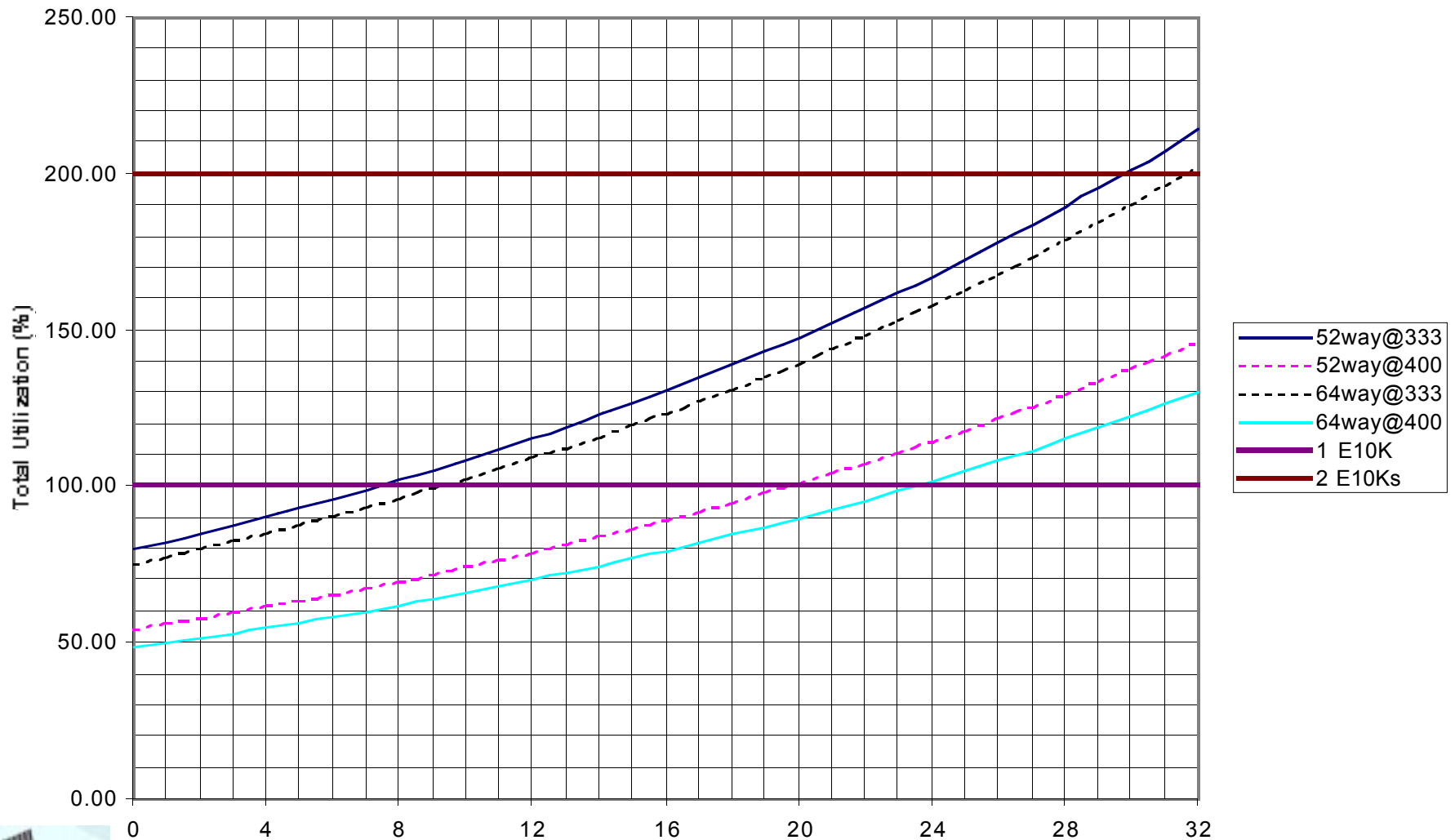
- 3 **Do both: 64-way@400MHz + 8MB cache**

- **Expect => 39% headroom gained (cf. 52% previously)**



Realistic Growth

CPU Upgrade Scenarios - Realistic



Summary

- Use *multivariate regression* for **short-term** effects
 - Daily data collection and *Effective Demand* model
 - Weekly summarization
- Use *nonlinear regression* for **long-term** effects
 - Used weekly summaries for *growth* model
- See Ch.6 in *The Practical Performance Analyst*, McGraw-Hill, 1998.
- If you'd like to learn more about this kind of capacity planning, consider attending Dr.Gunther's class *Guerilla Capacity Planning*, in August and November, 2000.
- Visit <http://www.perfdynamics.com> for more information about these and other topics.

