

Performance Modeling of Computer Systems and Networks

Prof. Vittoria de Nitto Personè

Performance Sensitivity to the Service time distribution

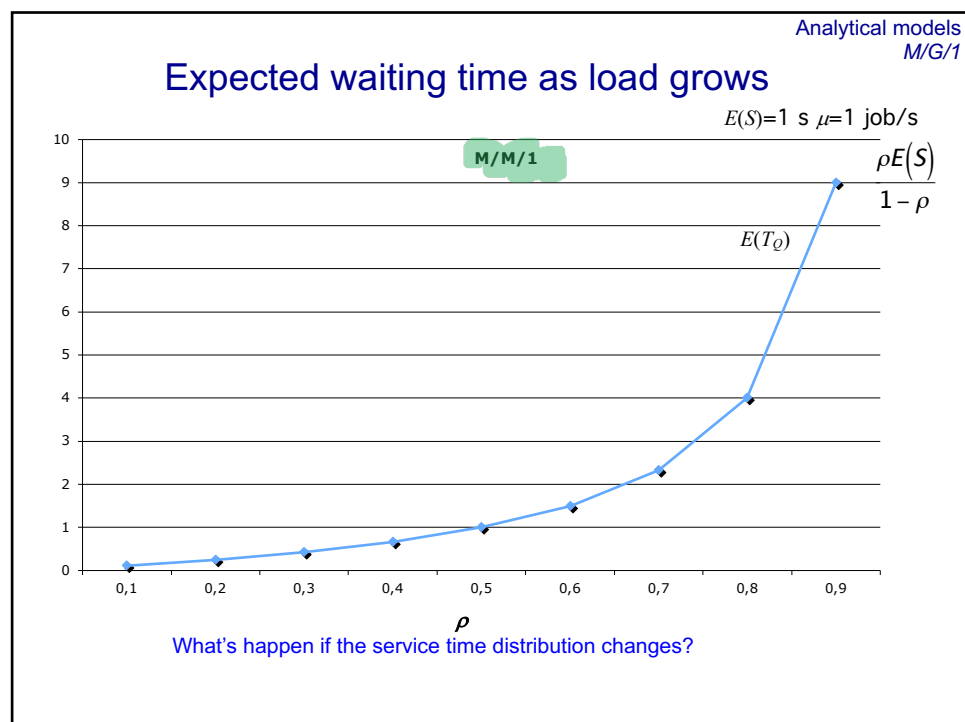
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The Khinchin Pollaczek equation (KP)

$$E(N_Q) = \frac{\rho^2}{2(1-\rho)}[1+C^2], \quad E(T_Q) = \frac{\rho}{1-\rho} \frac{C^2+1}{2} E(S)$$

$$C^2(S) = \frac{\sigma^2(S)}{E^2(S)}$$

Expected waiting time in an M/G/1 queue can be huge, even under very low utilization ρ , if C^2 is huge.

(se C^2 grande, anche con ρ piccolo, posso avere tempi di attesa rilevanti, perché ho alta variabilità)

$$\left. \begin{array}{l} D \longrightarrow C^2=0 \\ M \longrightarrow C^2=1 \\ E_k \longrightarrow C^2 = \frac{1}{k} \\ H_2 \longrightarrow C^2 = g(p) = \frac{1}{2p(1-p)} - 1 \end{array} \right\}$$

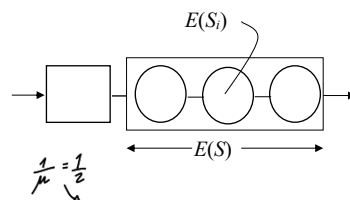
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Expected waiting time as load grows: Erlang case

$$E(S)=0.5 \text{ s } \mu=2 \text{ job/s}$$



$$E(S_i) = \frac{0.5}{3} = 0.166666666 \text{ s} \quad \text{tempo medio nello stato "i".}$$

$$\sigma^2(S) = \frac{1}{k} \left(\frac{1}{\mu} \right)^2 = 0.08333333$$

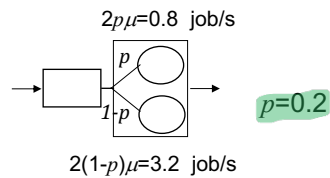
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Expected waiting time as load grows: Hyperexponential case

Analytical models
M/G/1



$$E(S) = 0.5 \text{ s } \mu = 2 \text{ job/s}$$

in media, il 20% del traffico
riceve servizio con tempo $\frac{1}{3.2}$,
mentre il restante $\frac{1}{0.8}$ (tempo maggiore)

$$\sigma^2(S) = g(p) \left(\frac{1}{\mu} \right)^2 = 0.53125$$

varianza

$$g(p) = \frac{1}{2p(1-p)} - 1 = 2.125$$

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The Khinchin Pollaczek equation (KP)

Analytical models
M/G/1

$$g(p) = \frac{1}{2p(1-p)} - 1$$

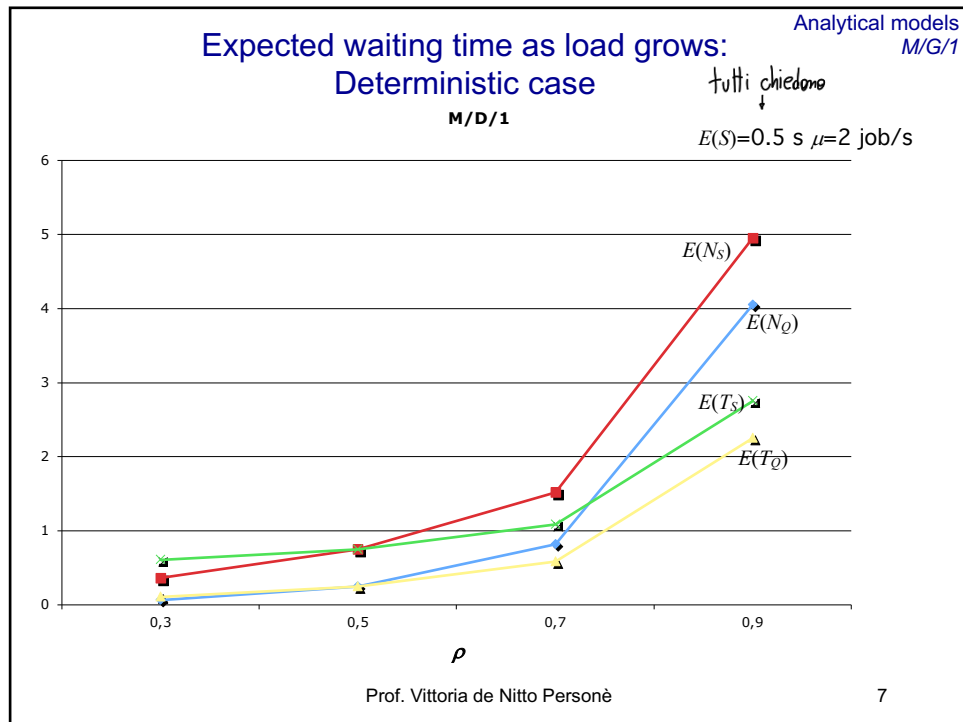
$$E(N_Q) = \frac{\rho^2}{2(1-\rho)} [1 + C^2], \quad E(T_Q) = \frac{\rho}{1-\rho} \frac{C^2 + 1}{2} E(S)$$

Service time	$E(N_Q)$	$E(T_Q)$
Deterministic, M/D/1	$\frac{\rho^2}{2(1-\rho)}$	$\frac{\rho E(S)}{2(1-\rho)}$
Markovian, M/M/1	$\frac{\rho^2}{1-\rho}$	$\frac{\rho E(S)}{1-\rho}$
K-Erlang, M/E _k /1 $\sigma^2(S) = \frac{E(S)^2}{k}$	$\frac{\rho^2}{2(1-\rho)} \left(1 + \frac{1}{k} \right)$	$\frac{\rho E(S)}{2(1-\rho)} \left(1 + \frac{1}{k} \right)$
Hyperexpo, M/H ₂ /1 $\sigma^2(S) = E(S)^2 g(p)$	$\frac{\rho^2}{2(1-\rho)} (1 + g(p))$	$\frac{\rho E(S)}{2(1-\rho)} (1 + g(p))$

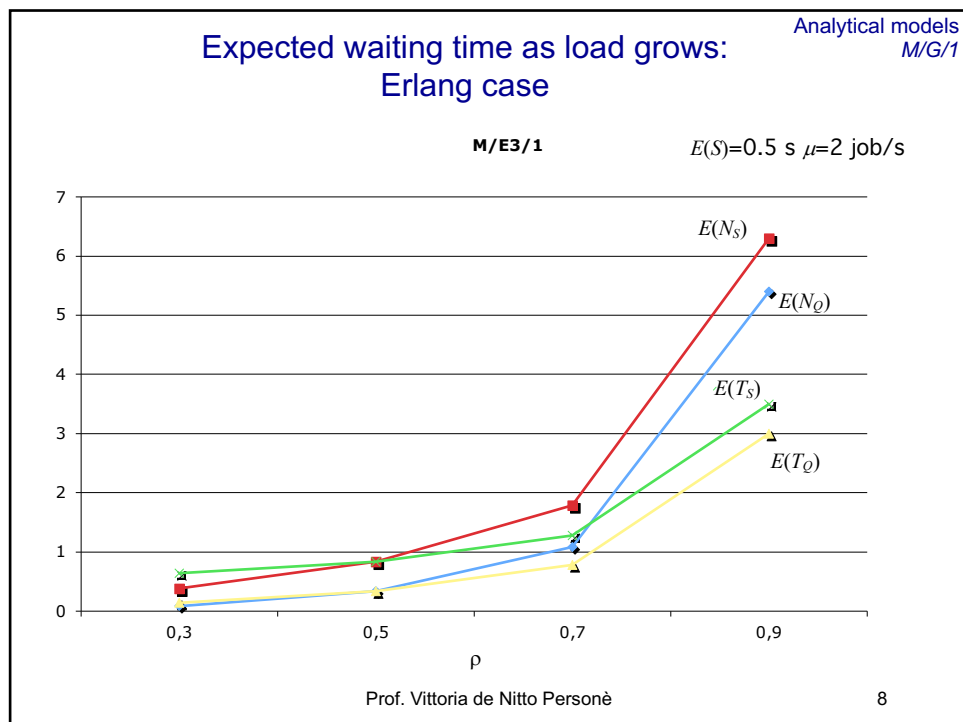
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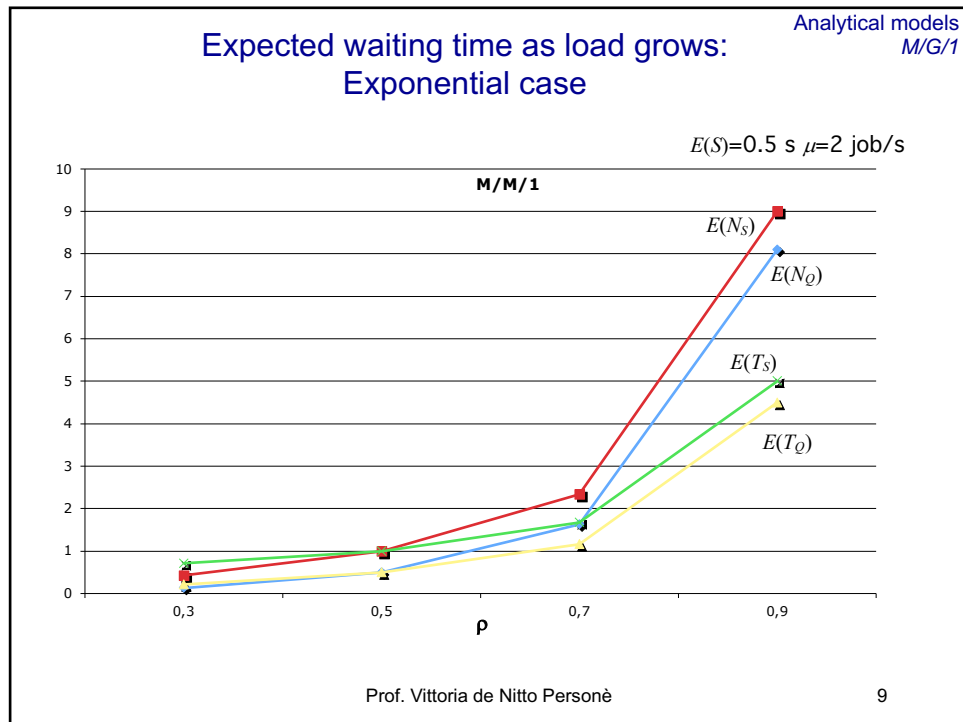
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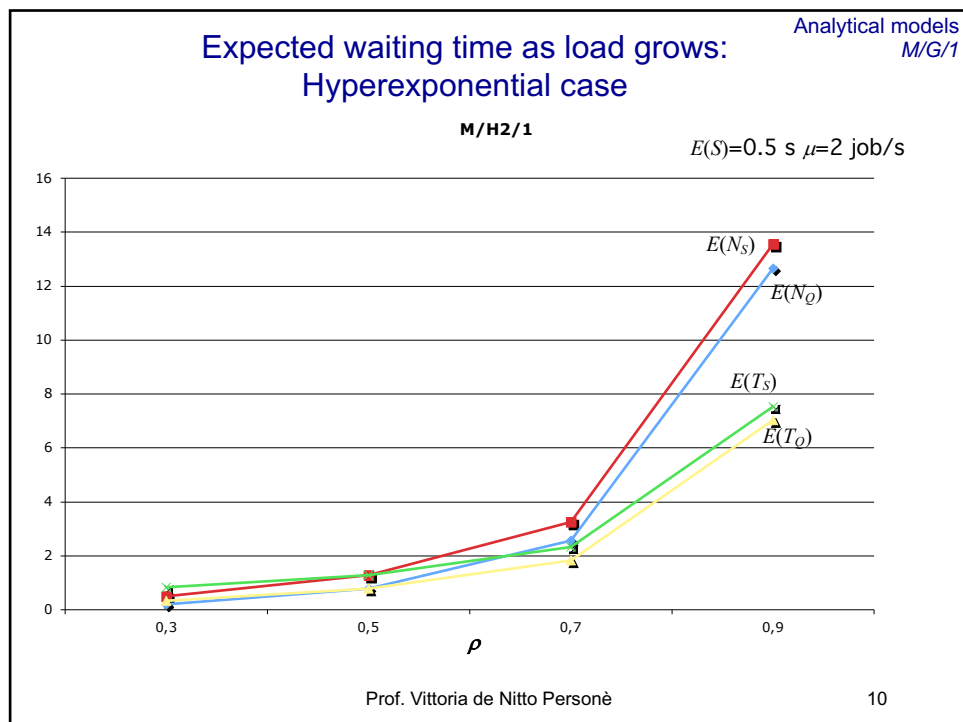
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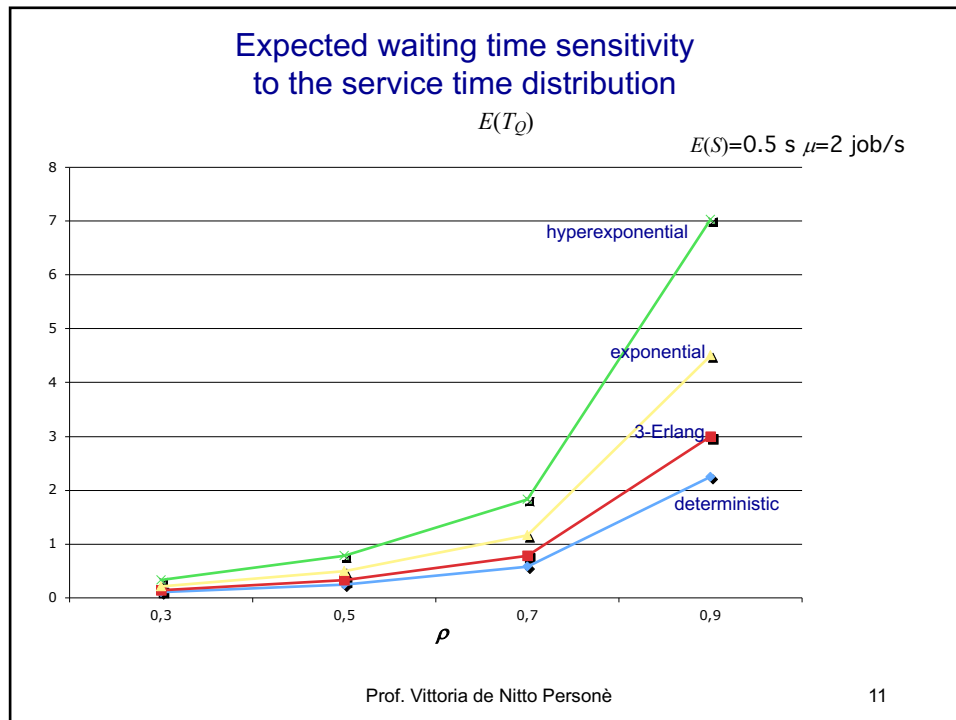
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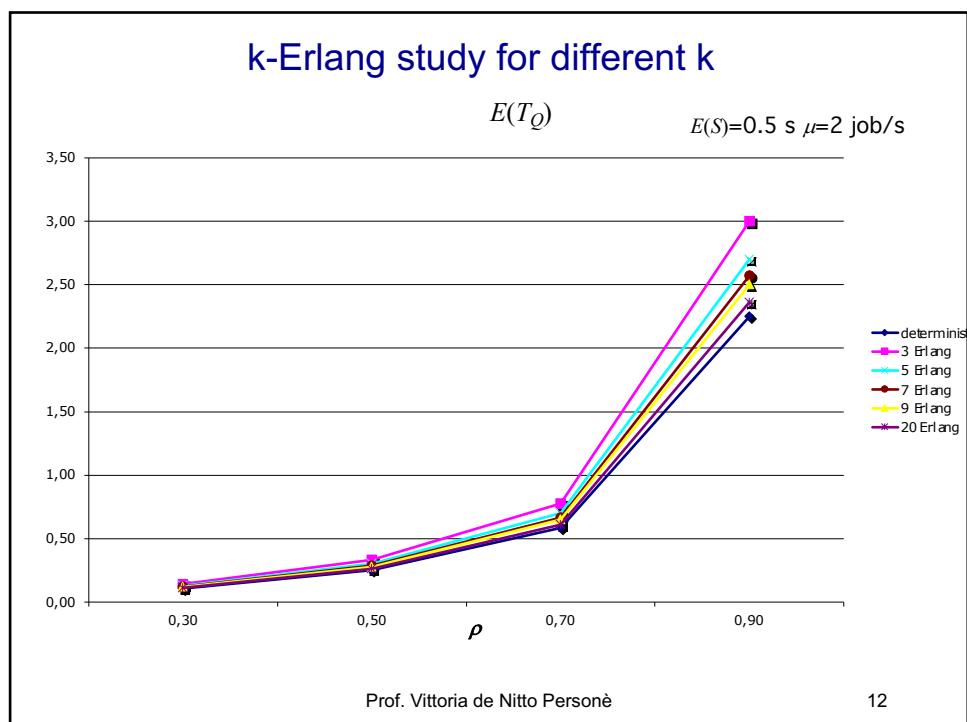
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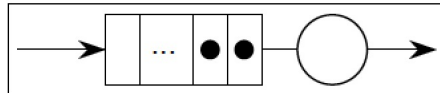


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A TP system accepts and processes a stream of transactions, mediated through a (large) buffer:



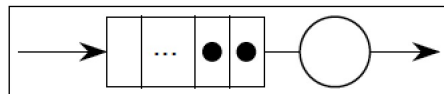
- Transactions arrive “randomly” at some specified rate (= *interarrivo esponenziale*)
- The TP server is capable of servicing transactions at a given service *rate*

Q: If both the arrival rate and service rate are doubled, what happens to the mean response time?

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- The arrival rate is 15tps = λ , $\lambda' = 15 \cdot 1,10 = 16,5$
- The mean service time per transaction is 58.37ms = $\frac{1}{\mu} = 0,058375 \rightarrow \mu = 17,13$

Q: What happens to the mean response time if the arrival rate increases by 10%?

$$\rightarrow \rho = \frac{\lambda}{\mu} = \frac{15}{17,13} = 87,56 \% , \quad \rho' = 96,31\%$$

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SVOLGIMENTO

Punto da KP generale, perchè non so la distribuzione!

$$E(T_Q) = \frac{\rho}{1-\rho} \frac{C^2+1}{2} E(S)$$

INVARIATO:
cambia solo tasso arrivi

$$E(T_{Q'}) = \frac{\rho'}{1-\rho'} \frac{C^2+1}{2} E(S)$$

$$\frac{E(T_Q)}{E(T_{Q'})} \approx 0,27 \approx \frac{1}{3,7}$$

$$E(T_a) = 3,7 \cdot E(T_a)$$

$$E(T_s) = E(T_a) + E(S)$$

$$E(T_s') = 3,7 \cdot E(T_a) + E(S)$$

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Heavy tail distributions properties

esponenziale \longrightarrow memoryless
failure rate costante

Heavy tail \longrightarrow failure rate decrescente
(Pareto: $r(x) = \alpha / x, x > 1$)

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Where they are

Jobs Unix

Sizes files websites $\alpha \approx 1.1$

Internet topology

Packet n° IP flows 1% \rightarrow 50%

Natural phenomena

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Pareto

$$f(x) = \alpha k^\alpha x^{-\alpha-1} \quad k \leq x < \infty$$

α , parametro di forma

$$E[X] = \frac{\alpha k}{\alpha - 1} \quad \alpha > 1$$

$$\sigma^2[X] = \frac{\alpha k^2}{(\alpha - 1)^2 (\alpha - 2)} \quad \alpha > 2$$

$$f(x) = \alpha x^{-\alpha-1} \frac{k^\alpha}{1 - \left(\frac{k}{p}\right)^\alpha} \quad k \leq x \leq p, 0 < \alpha < 2$$

combinando e trovo $E[Ta]$

se mi allontano da $\alpha = 2$ mi allontano dal caso peggiore ($\alpha < 2$ heavy tail)

(Vilfredo Pareto, 15 July 1848 – 19 August 1923, economista e sociologo)

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Pareto

$$E(T_Q) = \frac{\rho}{1-\rho} \frac{C^2+1}{2} E(S)$$

$$C^2(S) = \frac{\sigma^2(S)}{E^2(S)}$$

$$E(T_Q) = \frac{\rho E[S]}{1-\rho} \frac{1+\alpha(\alpha-2)}{2\alpha(\alpha-2)}$$

$$\alpha > 2$$

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Pareto study as load grows

$$E(S)=0.5 \text{ s } \mu=2 \text{ job/s}$$

$$E(T_Q)$$

ρ	$\alpha = 2,01$	$\alpha = 2,05$	$\alpha = 2,1$	$\alpha = 2,15$	determ	3-Erlang	expo	hyper
0,3	5,437633262	1,152439024	0,617346939	0,439368771	0,107	0,142	0,213	0,333
0,5	12,68781095	2,68902439	1,44047619	1,025193798	0,25	0,333	0,5	0,781
0,7	30	6,274390244	3,361111111	2,392118863	0,583	0,778	1,167	1,823
0,9	114,1902985	24,20121951	12,96428571	9,226744186	2,25	3	4,5	7,031

(minimo per $\alpha=2,01$)

$$k=0.2512$$

$$k=0.2619$$

I tempi, anche al variare di α , esplodono con $\alpha \approx 2$!!

$$E[S] = \frac{\alpha k}{\alpha - 1} \xrightarrow[\alpha]{\text{fisso}} k_{\text{fisso}} \frac{\alpha - 1}{\alpha} E[S]$$

con carico $\rho=0,3$ ←

passando a $\rho=0,7$, il tempo atteso nella coda

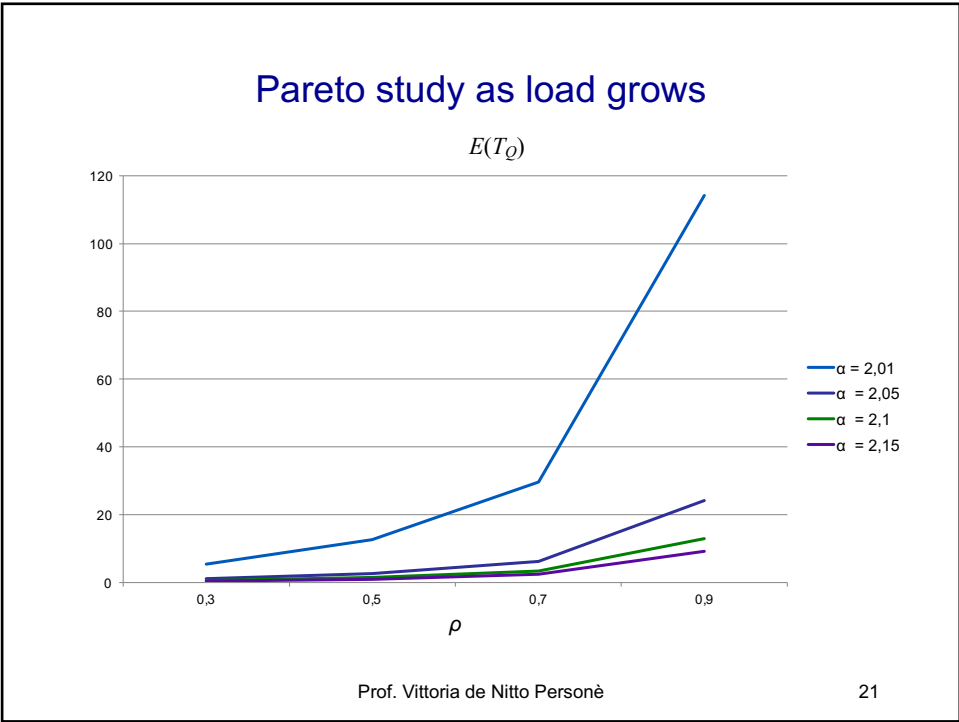
passa da 0,333 a 1,823 (5,5 volte in più), fino a

7,031 con $\rho=0,9$. Tutto ciò

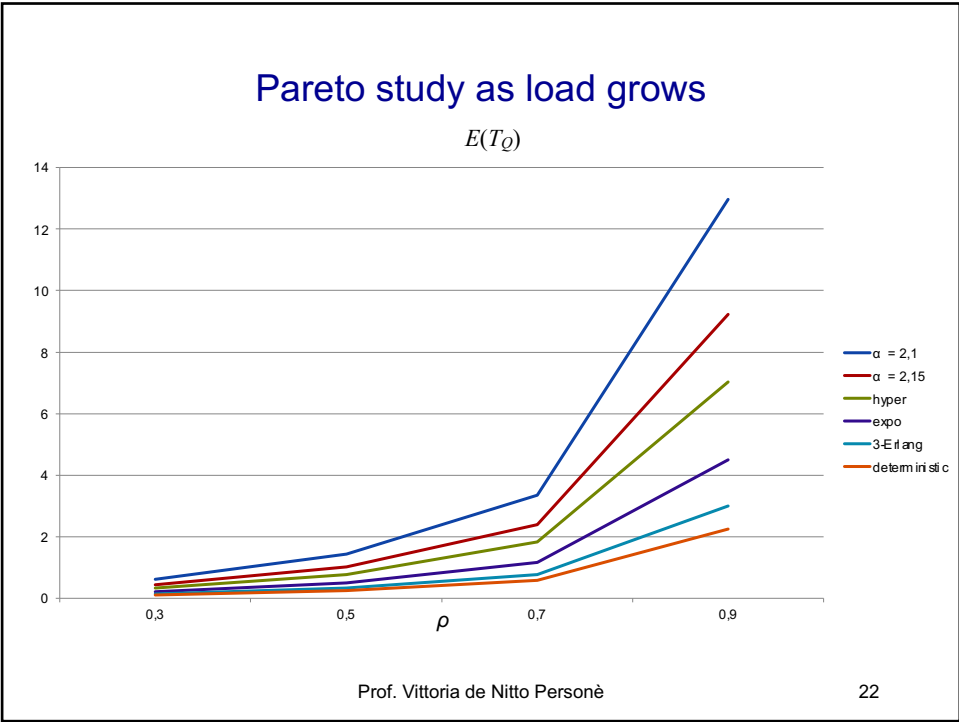
con $E(S)=0,5$ (piccolo) 20

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20 Tra le distribuzioni, la peggiore è l'hyperesponenziale, ma le Pareto, in questi test, sono ancora peggio!! La variabilità impatta fortemente!



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