

# Mathematical Model for Athletic Training

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# Two Types of Athletes

Genetically Talented



Hard-working



VS.

**How do we manage  
athletic training?**





# Common Methods

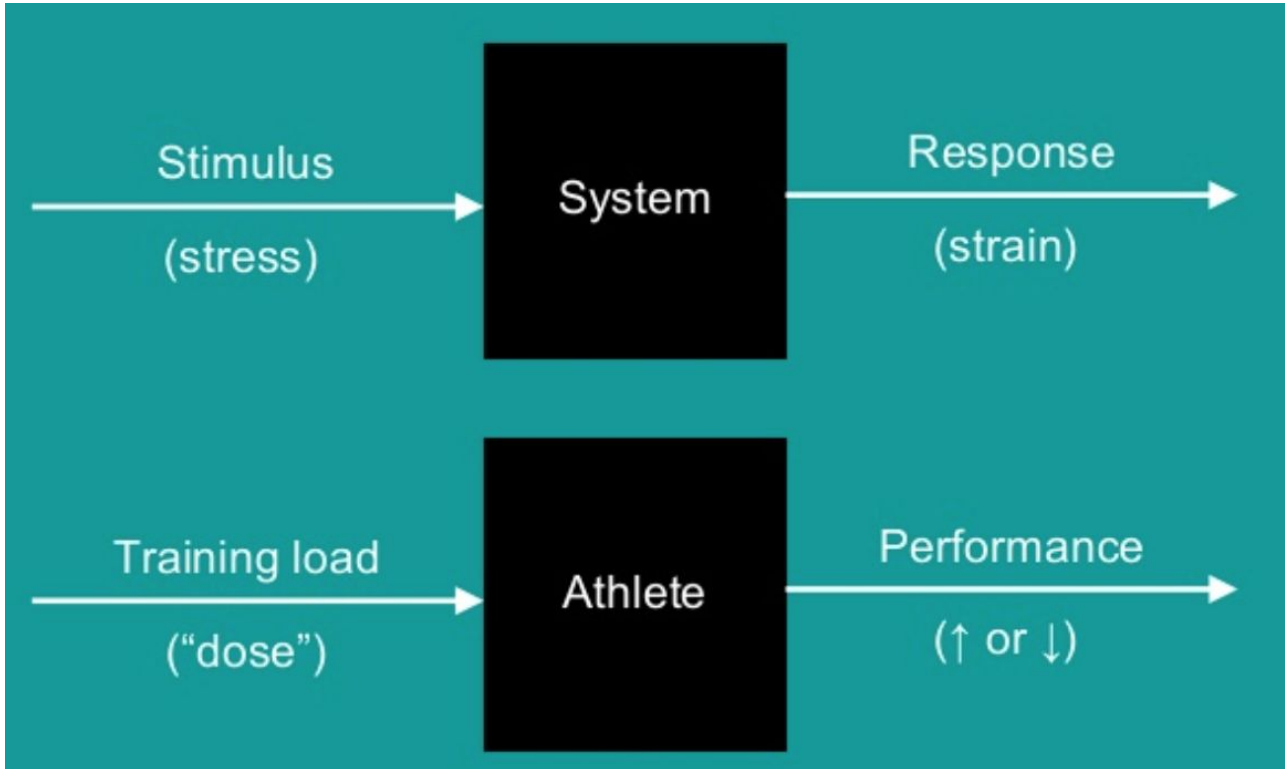
- Tradition (experience)
- Empiricism
- Application of basic training principles



# More Quantitative Approaches

- Training Stress Balance (TSB) Model
- The Busso Model
- The Banister Model

# Impulse-Response Model





# The Banister Model

- Proposed by Banister in 1975
- Most experimentally validated
- Uses an exponential decay to model the effects of training stress
- Shows that a steady state of training will improve performance
- Quantify intensity based on heart rate



# The Banister Model

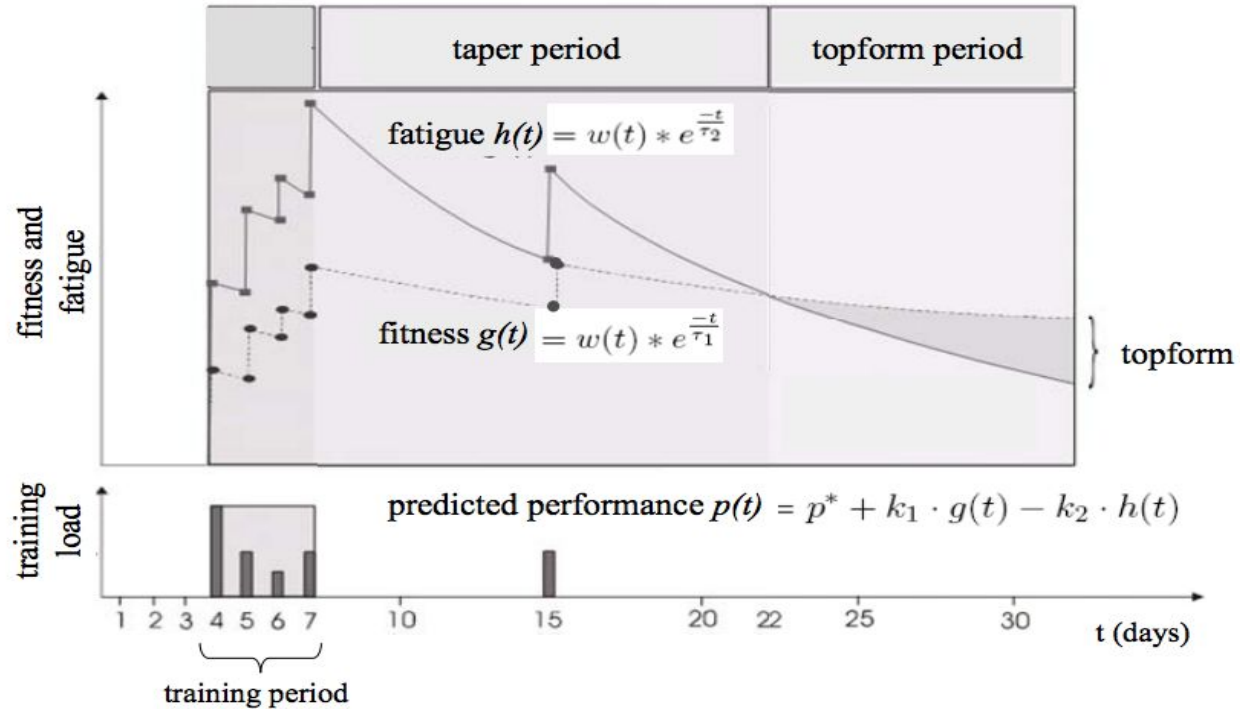
$$p_t = p_0 + k_a \sum_{s=0}^{t-1} e^{-(t-s)/\tau_a} w_s - k_f \sum_{s=0}^{t-1} e^{-(t-s)/\tau_f} w_s$$

- $k_a$  and  $k_f$  = fitness and fatigue magnitude factor, respectively
- $\tau_a$  and  $\tau_f$  = fitness and fatigue decay time constant, respectively
- $w_t$  = the known training load per week/day from the first day of training to the week/day preceding the performance

\* The original paper used values of  $k_a=1.0$ ,  $k_f=1.8\sim 2.0$ ,  $\tau_a=49\sim 50$ ,  $\tau_f=11$



# Graphical Illustration





# Flaws of the Banister Model

- The parameters are specific to each person and training system, so it takes a lot of steps just to start using the model to predict
- All trainings are summed into one, not considering individualization caused by variability in training types
- Ignores the effect of overtraining and assumed that any workload would result in improved performance of some degree (direct linear relationship)



# Examining the Model

- People have used  $R^2$  as a measure of validity of this model
- Only means how much variability is explained
- Not necessarily accurate predictions



# Starting with...

Selected characteristics of the subjects training over the one-year period studied.

S	G	Age (years)	Height (cm)	Weight (kg)	Training (km)	Event	Best Perf	Number of Perf's	CV of Perf (%)
1	F	24	168	61	1402	100 Free	00:55:65	11	2.3
2	F	21	173	62	1856	200 Butt	02:10:8	12	1.6
3	F	26	179	59	1677	200 Free	01:59:86	21	2.2
4	M	27	185	84	1751	200 Medl	02:01:83	12	1.9
5	M	23	181	81	1340	100 Breast	01:03:51	14	1.8
6	F	26	168	50	1477	200 Back	02:15:00	18	2.4
7	M	20	186	80	1815	100 Free	00:51:5	12	2.6
8	F	19	167	52	1916	200 Free	02:03:51	11	1.6
9	M	23	188	84	1843	400 Free	03:53:42	13	1.5
Mean		23.2	177.2	68.1	1675			13.2	2.0
s.d.		2.8	8.4	14.0	215			2.4	0.4



## Examining the Model

Due to the nature of the measures of swimming performances, we express the performance at time  $t$  as follows:

$$p_t = \frac{\min_t(P_t)}{P_t} * 100.$$



# Examining the Model

From Matlab:

$$\tau_a = 41.4 \text{ days}$$

$$\tau_f = 12.4 \text{ days}$$

$$k_a = 0.128 \text{ a.u.}$$

$$k_f = 0.055 \text{ a.u.}$$

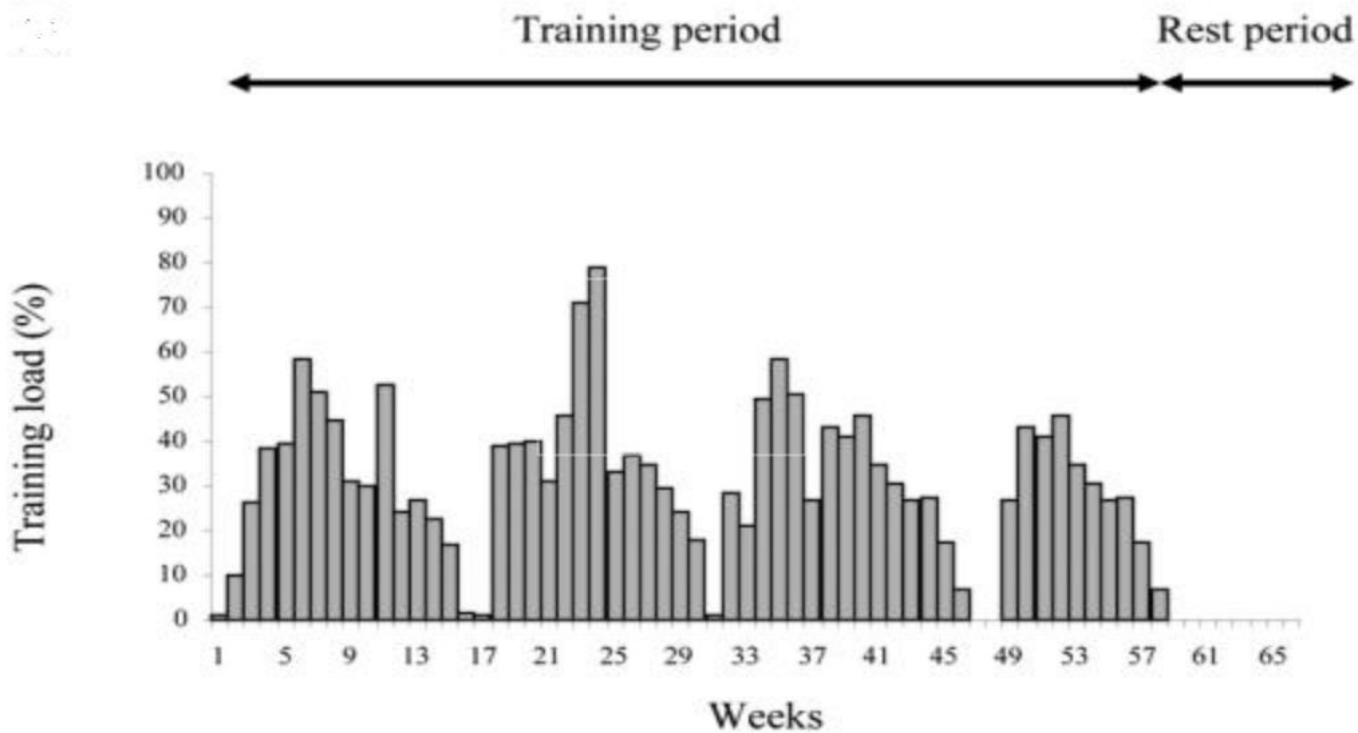


# Quantify Training Load

- Blood lactate concentration
- 7 intensity levels
- 13 => onset of blood lactate accumulation



# Example of Subject 3

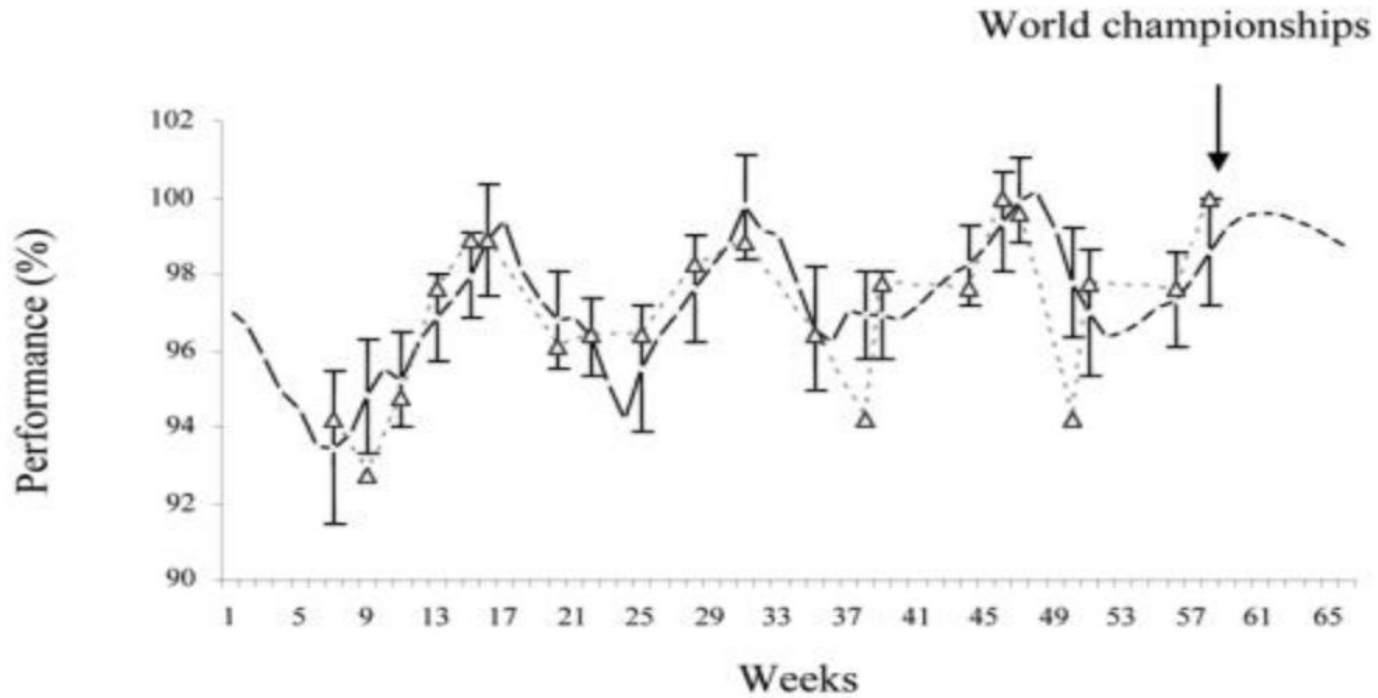




**Before we see the  
result...**



## Example of Subject 3



# Parameter Observations and Predictions

S	$P_0$	CI $p_0$	$k_a$	CI $k_a$	$k_f$	CI $k_f$	$\tau_a$	CI $\tau_a$	$\tau_f$	CI $\tau_f$	$R^2$	MIW
1	0.92	0.89, 0.95	0.002	-0.040, 0.044	0.016	-0.018, 0.051	40	8, 71	5	-6, 16	0.69 <sup>*</sup>	3.17
2	0.95	0.92, 0.98	0.106	0.022, 0.189	0.129	0.071, 0.185	13	-6, 33	11	7, 15	0.84 <sup>†</sup>	1.99
3	0.97	0.93, 1.01	0.039	0.006, 0.071	0.048	0.016, 0.081	33	8, 57	27	8, 46	0.65 <sup>*</sup>	2.69
4	0.97	0.95, 0.98	0.050	-0.029, 0.068	0.068	0.048, 0.088	27	14, 40	20	15, 25	0.97 <sup>§</sup>	0.80
5	0.98	0.95, 1.01	0.003	-0.040, 0.046	0.022	-0.012, 0.057	41	11, 70	9	-1, 19	0.78 <sup>†</sup>	1.80
6	0.90	0.84, 0.94	0.009	-0.014, 0.034	0.016	-0.009, 0.041	45	18, 71	18	4, 32	0.61 <sup>§</sup>	2.04
7	0.90	0.78, 1.02	0.018	-0.012, 0.046	0.028	-0.003, 0.057	57	39, 75	31	17, 46	0.95 <sup>§</sup>	1.55
8	0.95	0.92, 0.97	0.083	0.019, 0.148	0.112	0.048, 0.176	23	11, 34	16	9, 24	0.92 <sup>§</sup>	1.58
9	0.93	0.90, 0.96	0.010	-0.024, 0.046	0.012	-0.016, 0.042	65	50, 81	38	3, 64	0.73 <sup>*</sup>	2.44
Mean	0.94	0.90, 0.98	0.036	-0.012, 0.077	0.050	0.014, 0.086	38	17, 59	19	6, 32	0.79	1.89
s.d.	0.03		0.038		0.044		16		11		0.13	0.49



## Conclusion of Test

- Does not show difference among groups of swimmers that have different targeted trainings
- Peak performance in the rest period after 3-4 weeks of zero training which is not consistent with other proved ideas
- Does cover a good amount of sample variability but the intervals are a bit too large that the information becomes less useful



## Modified Model by Busso

- The Busso Model was built on Banister's model
- Considered training monotony
- $k_f$  is changed into a function of training and is put into summation

$$k_2^i = k_3 \sum_{j=1}^i w(j) e^{-(i-j)/\tau_3}$$

$$p(t) = p(0) + k_1 \sum_{i=1}^{t-1} w(i) e^{-(t-i)/\tau_1} - \sum_{i=1}^{t-1} k_2^i w(i) e^{-(t-i)/\tau_2}$$



## Other Suggestions

- Limit maximum fitness level
- Consistent, universal intensity classification to ensure stability of prediction
- Model fitness/fatigue parameter changes to be able to use functions to implement more frequent updates without numerous measurements
- Modify constants that are highly correlated



## **Other Non-traditional Approaches**

- Linear mixed model
- Neural network

**Questions?**







## Source

- <http://ovidsp.tx.ovid.com/sp-3.31.1b/ovidweb.cgi?&S=IIDKFPMBLMDDMEPGNCEK KAFBMIIFAA00&Complete+Reference=S.sh.22%7c1%7c1>
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