

# 'Bayesian' and 'Frequentist' approaches to data-analysis

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# I distinguish 3 situations

- Life in general
- Single-study data-analysis
- Research-synthesis

# In Life: we use Bayes Theorem to learn/update

## **Bayesian integration in sensorimotor learning**

**Konrad P. Körding & Daniel M. Wolpert**

*Nature 427; 15 Jan 2004.*

“When we learn a new motor skill, such as playing an approaching tennis ball, both our sensors and the task possess variability. [ ... ] We show that subjects internally represent both the statistical distribution of the task and their sensory uncertainty, **combining them** in a manner consistent with a **performance-optimizing bayesian** process. The central nervous system therefore employs probabilistic models during sensorimotor learning.”

**The New York Times**  
nytimes.com

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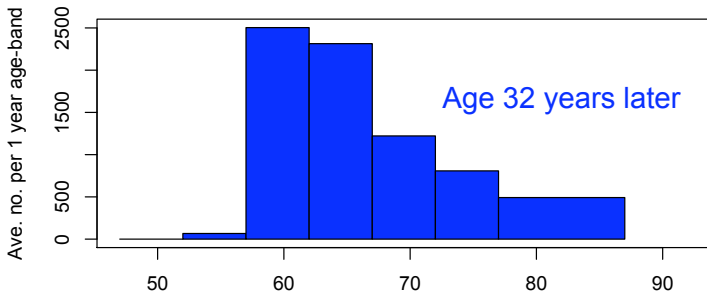
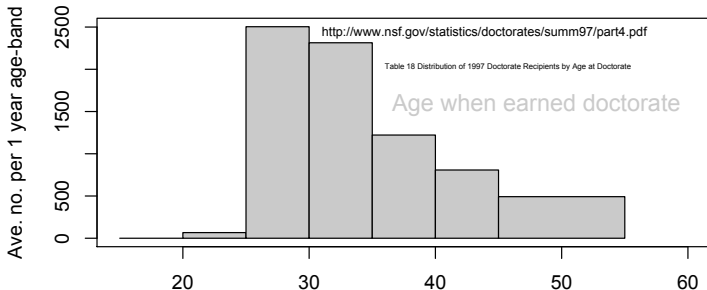
January 20, 2004

## **Subconsciously, Athletes May Play Like Statisticians**

What age is this person?



# Additional info: He obtained his PhD 32 years earlier



## Single-study data-analysis

- Likelihood-based parameter-fitting + frequentist-based interval estimation
- **IF** intractable ML fitting issues, measurement error, hierarchical models, ... , use a computer-intensive MCMC approach using a non-informative prior.
- In simple cases, (Frequentist) confidence intervals  $\approx$  (Bayesian) credible intervals. Since credible intervals involve  $\text{Prob}(\theta \mid \text{data})$  rather than  $\text{Prob}(\text{data} \mid \theta)$ , they are more natural, and easier to explain correctly.
- Present evidence just from study in question, preferably in a form [Likelihood] that can be merged with evidence from other studies.

## Synthesis of data from several sources

- Simplest case: meta-analysis
- If no unanimity about past evidence, present range of posteriors based on range of pessimistic  $\leftrightarrow$  optimistic priors.
- Combining prior + data: is it same as adding (log) probability densities ?

$$p_{photo+PhD}(age) \propto p_{photo}(age) \times p_{ageAtPhD}(age - 32)$$

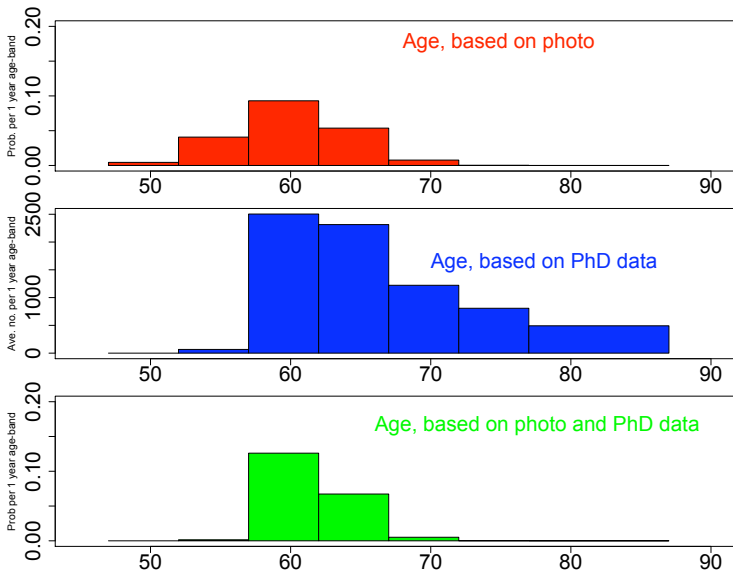
$$\propto p_{photo}(age) \times p_{ageAtPhD+32}(age)$$

# What age is this person?

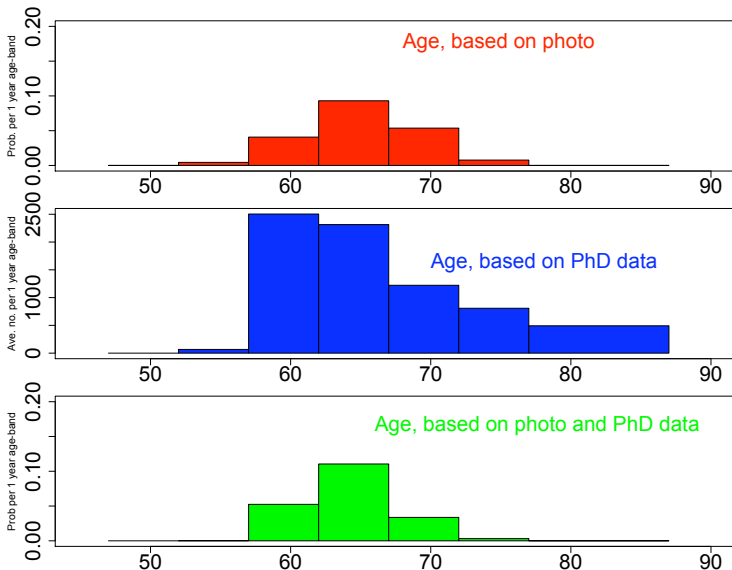




# What age is this person?



# What age is this person?



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