



The University of Sheffield
Department of Probability and Statistics



Uncertainty in Dating Ice Cores

Stories from Ice Cores

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 - Ice Cores as Archives
 - Existing Dating methods

- Some Theory
 - Glaciological Model and its Uncertainty
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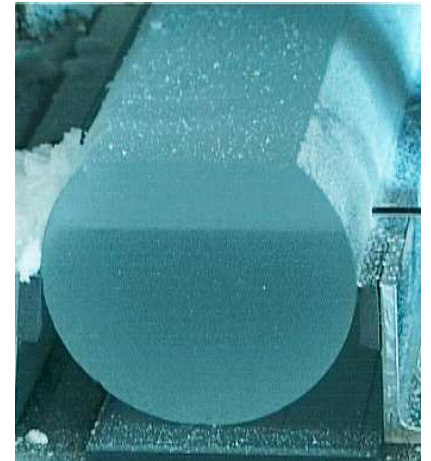
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Theory in a Nutshell

The Dating Uncertainty

Discussion

- Preserve valuable information about the climate and environment of the past
- Record chemical composition of snow, dust and atmospheric gases with high resolution for up to 700,000 years and longer [Parrenin et al., 2007]



Source: BAS image database



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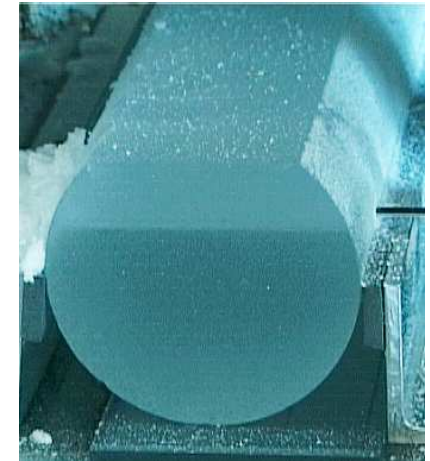
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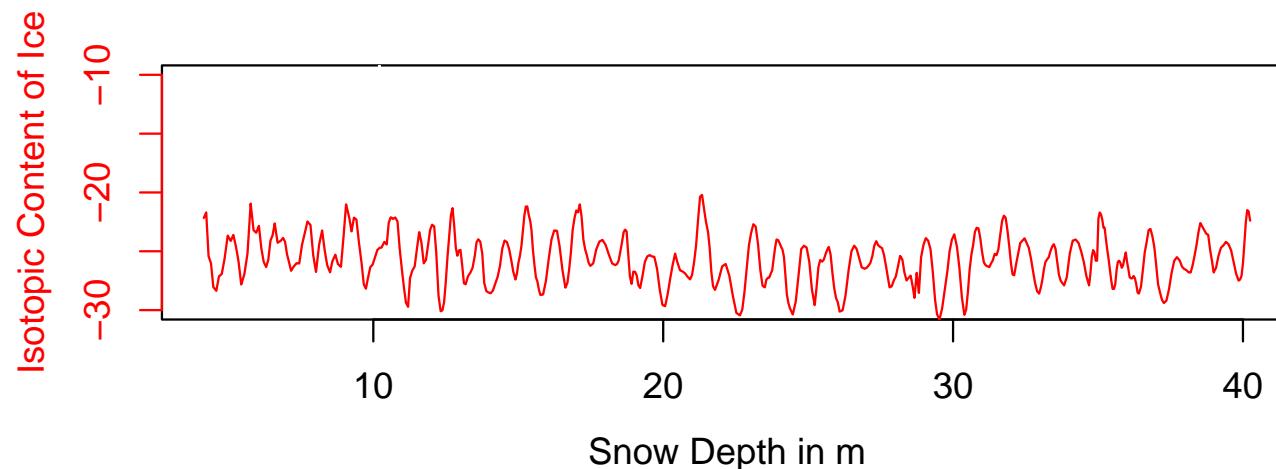
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- Preserve valuable information about the climate and environment of the past
- Record chemical composition of snow, dust and atmospheric gases with high resolution for up to 700,000 years and longer [Parrenin et al., 2007]
- Dating is essential to interpret this information
- Dating: relate time to depth



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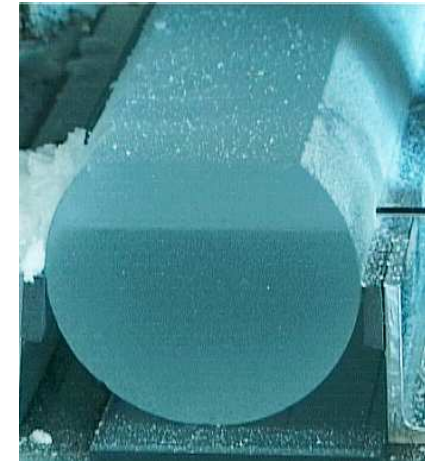
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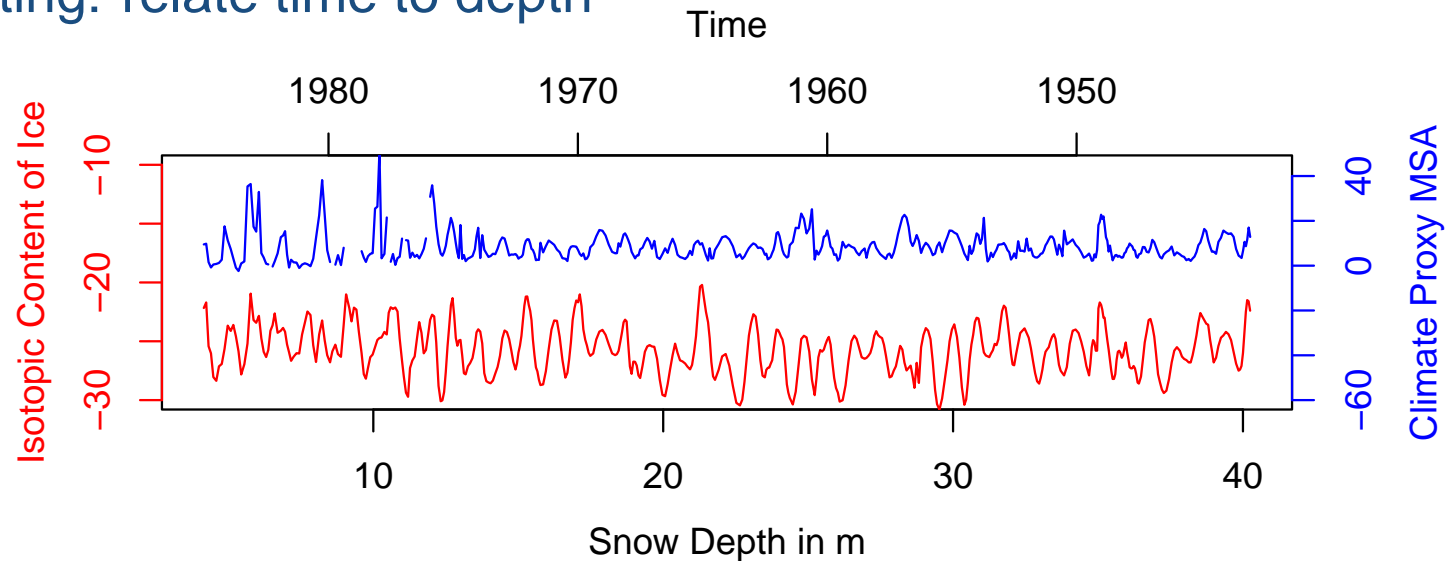
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Discussion

- layer counting using seasonality in signals

- glaciological modelling
 - model of accumulation:
estimated from isotopic content of ice
 - model of mechanical processes after accumulation:
i.e. firn densification, ice flow

- comparison with other dated records
 - e.g. ice cores, volcanic eruptions, insulation changes

- any combination of dating methods



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sufficient annual accumulation
error accumulates
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i.e. firn densification, ice flow
poorly known parameters
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uncertainty in other record
uncertainty in link between records
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- ⇒ quantify uncertainty in the accumulation model and derive the dating uncertainty



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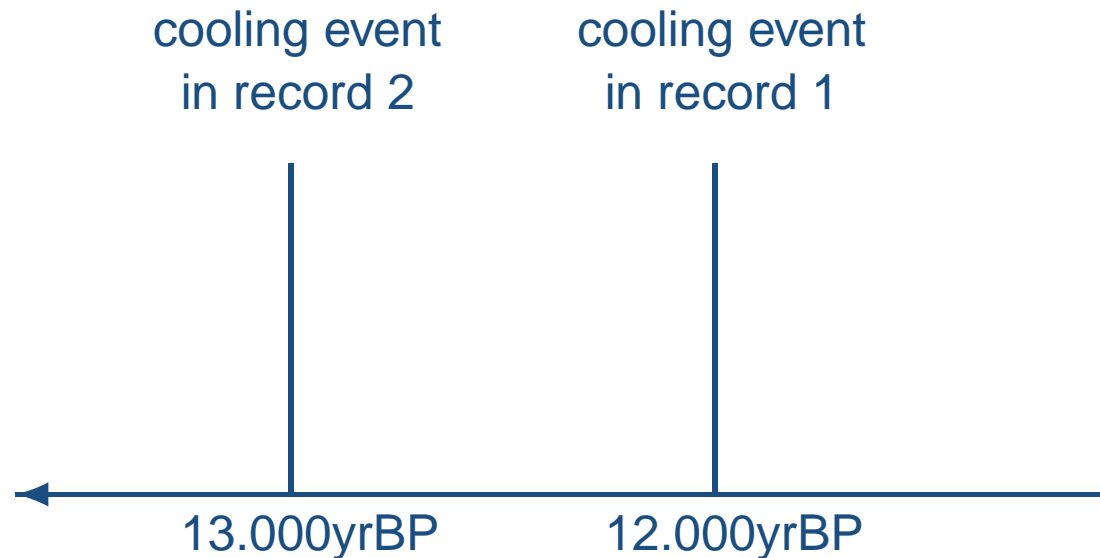
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Comparison with other dated records

- Did certain climatic events occur at different locations?
- Were they synchronous?





Uncertainty — a Nuisance the Essence!

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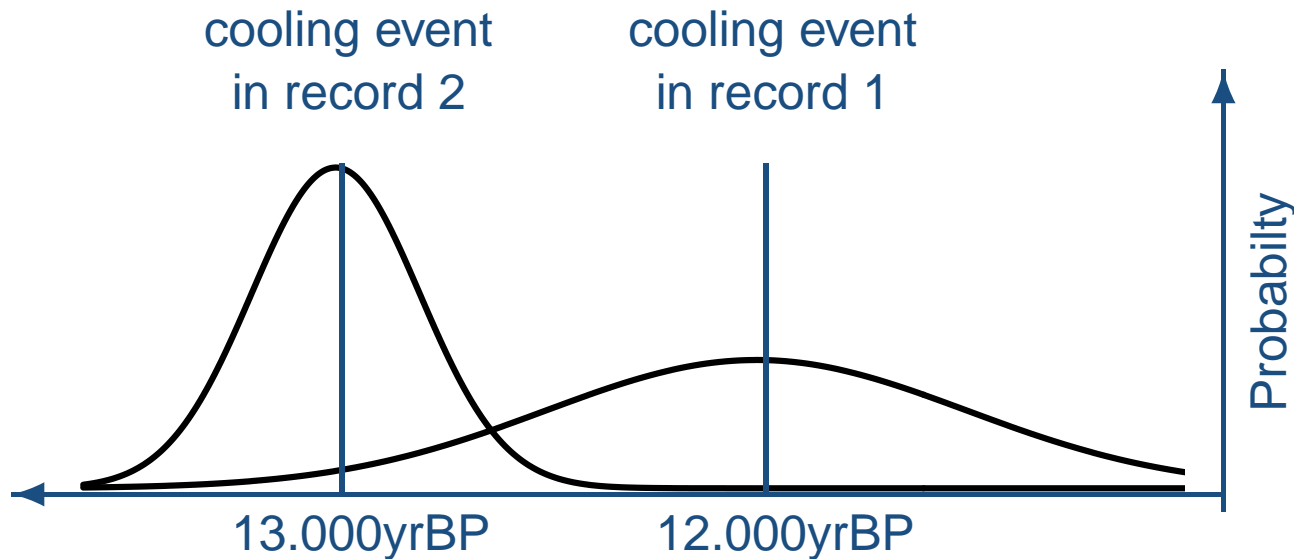
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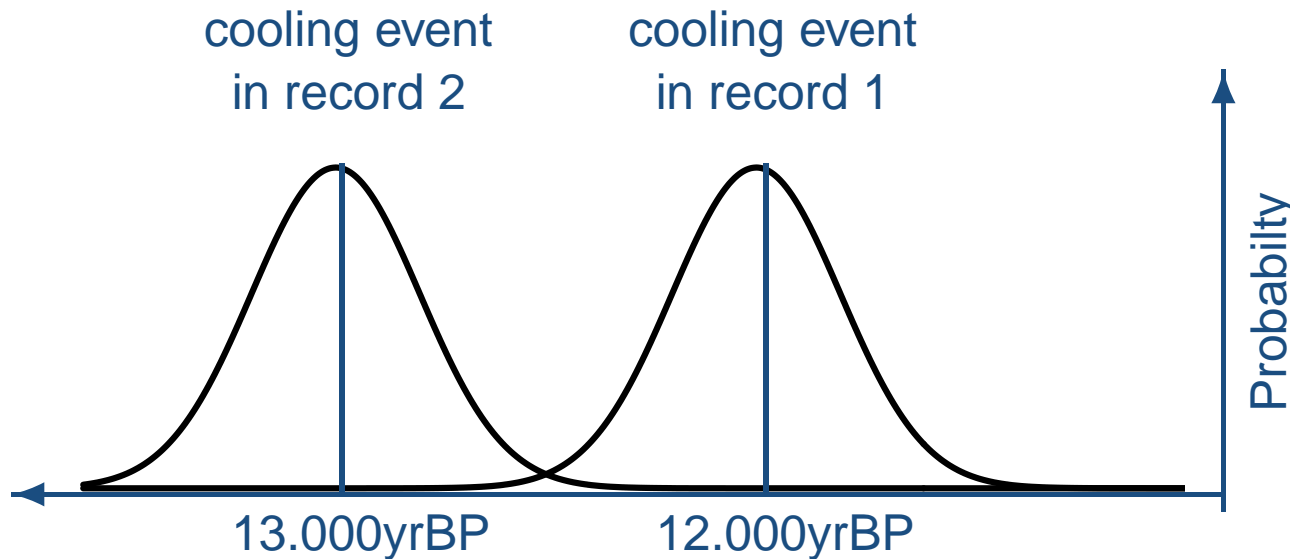
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⇒ Quantify uncertainty properly!



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- Bayesian Statistics
- Sources of Prior Knowledge

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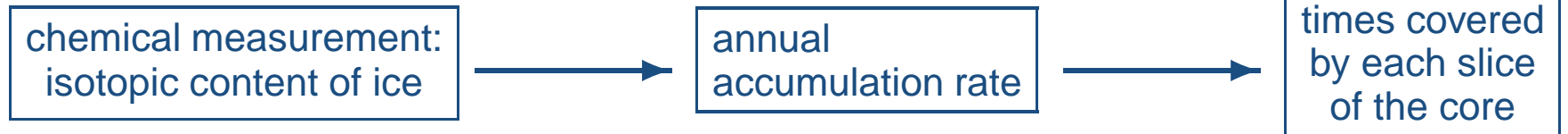
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Glaciological Model and its Uncertainty

Accumulation Model



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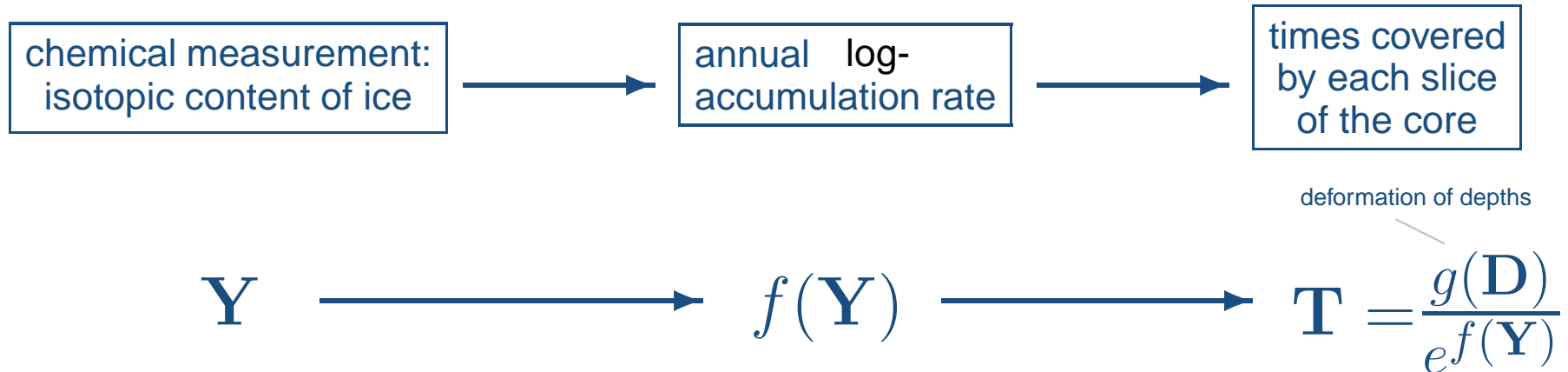
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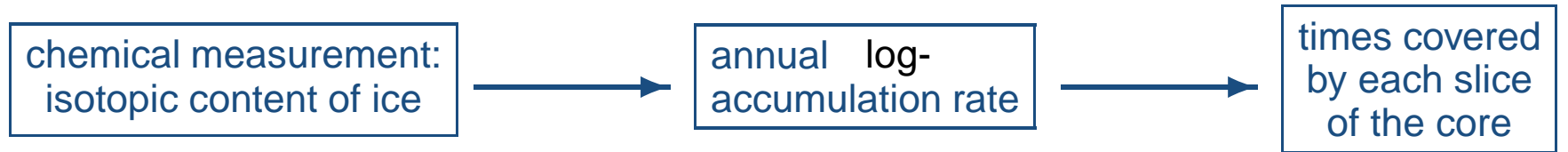
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Glaciological Model and its Uncertainty

Accumulation Model



deformation of depths

$$Y \longrightarrow f(Y) \longrightarrow T = \frac{g(D)}{e^{f(Y)}}$$

Its Uncertainty

$$Y \longrightarrow f(Y) = A + \varepsilon \longrightarrow T = \frac{g(D)}{e^A}$$

‘true’ log-accumul. rates

‘observed’ log-accumul. rate
f involves uncertain parameters

model error

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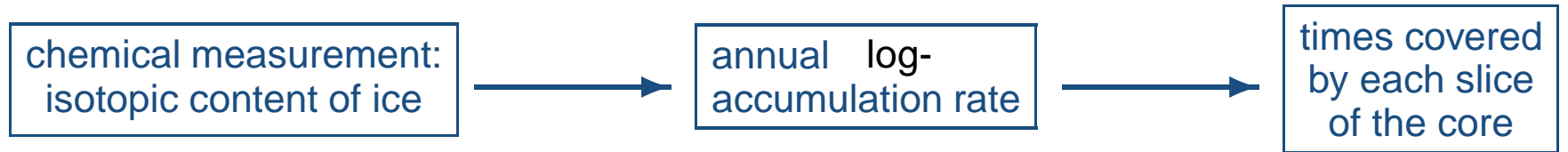
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Bayesian Statistics

$$f(\mathbf{Y}) = \mathbf{A} + \varepsilon$$

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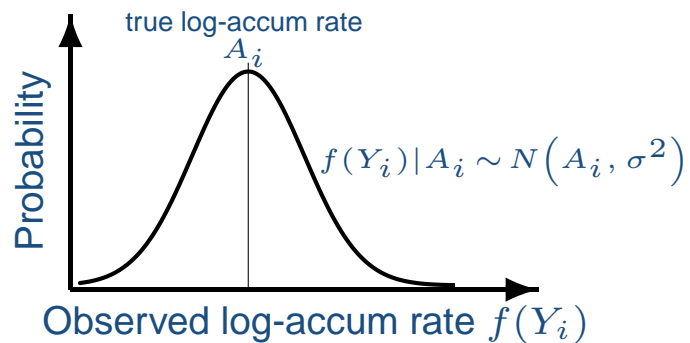
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The model error (likelihood)

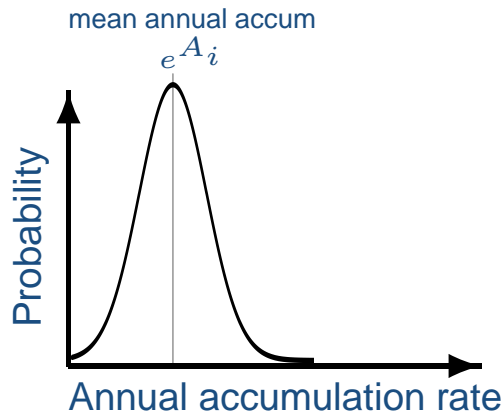




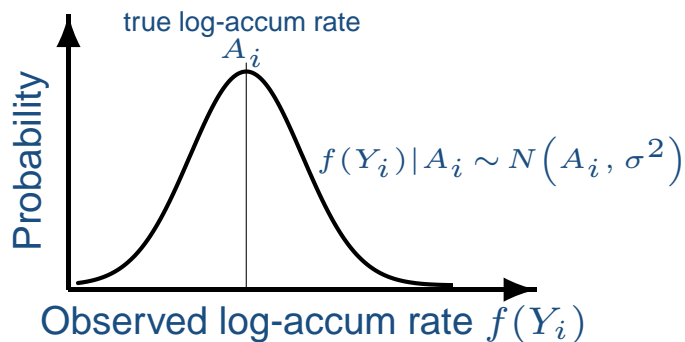
Bayesian Statistics

Knowledge from elsewhere (prior distribution)

$$f(\mathbf{Y}) = \mathbf{A} + \varepsilon$$



The model error (likelihood)



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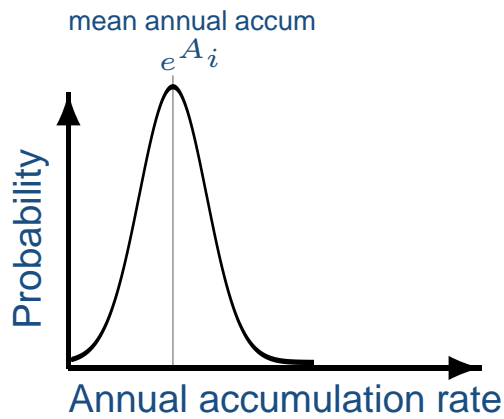
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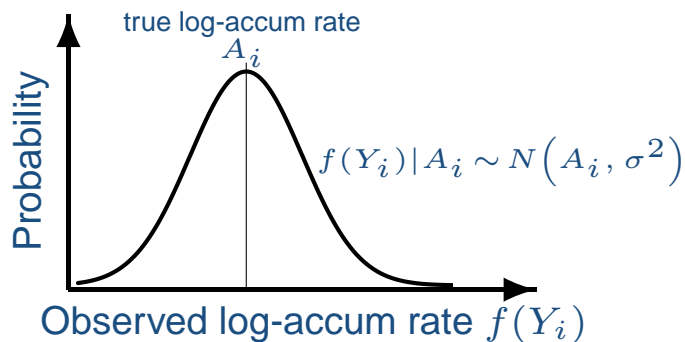
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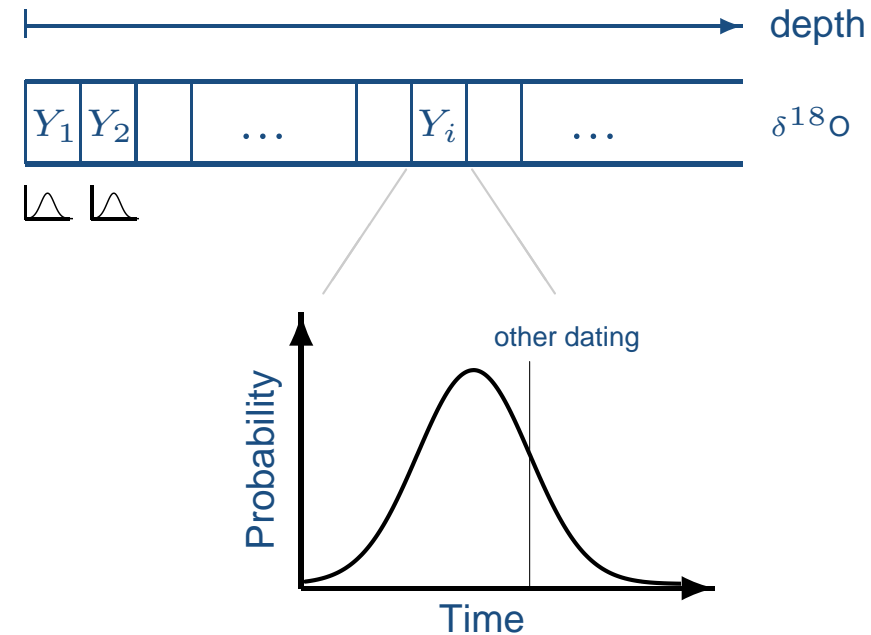


The model error
(likelihood)



$$f(\mathbf{Y}) = \mathbf{A} + \varepsilon$$

The dating uncertainty
(posterior distribution)



*



Sources of Prior Knowledge

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- recent weather records: do not capture climate in polar regions → accumulation model not applicable
- other ice cores: use layer counted (nearby) cores
- same ice core:
 - use $\frac{1}{2}$ of layer counted data to derive prior
 - use $\frac{1}{2}$ of layer counted data to compare our results (to explore the effect of prior assumptions on the dating uncertainty)



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- Effect of Uncertainty in Accumulation
- Effect of all Sources of Uncertainty

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Effect of Uncertainty in Accumulation

Toy example

A shallow core from Dyer Plateau,
Antarctica (70°39'S, 65°01'W)



http://en.wikipedia.org/wiki/Image:Flag_of_Antarctica.svg

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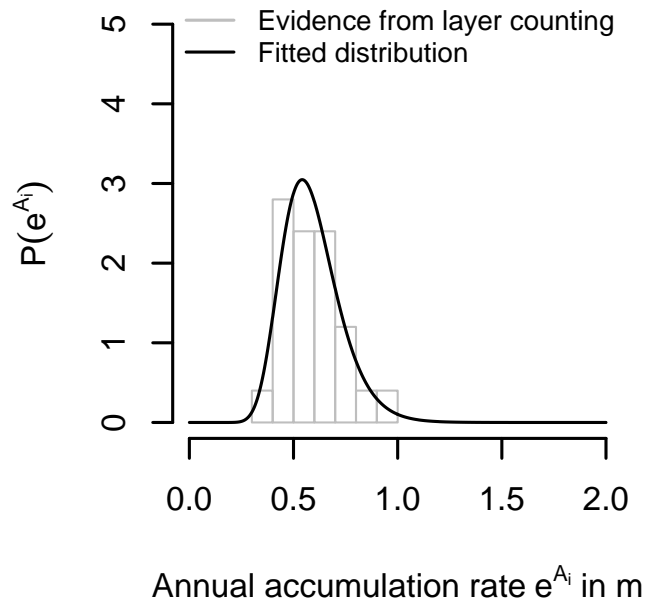
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Accumulation prior

Dating uncertainty





Effect of Uncertainty in Accumulation

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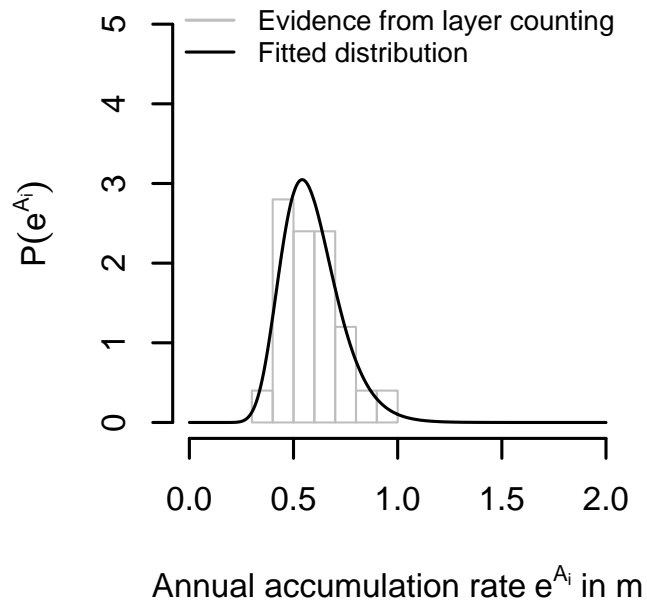
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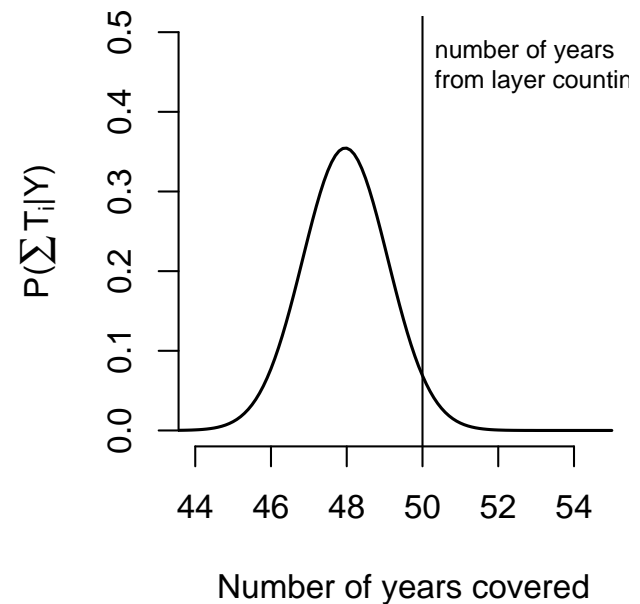
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Accumulation prior



fixed parameters

Dating uncertainty



47.96 ± 2.20 years



Effect of all Sources of Uncertainty

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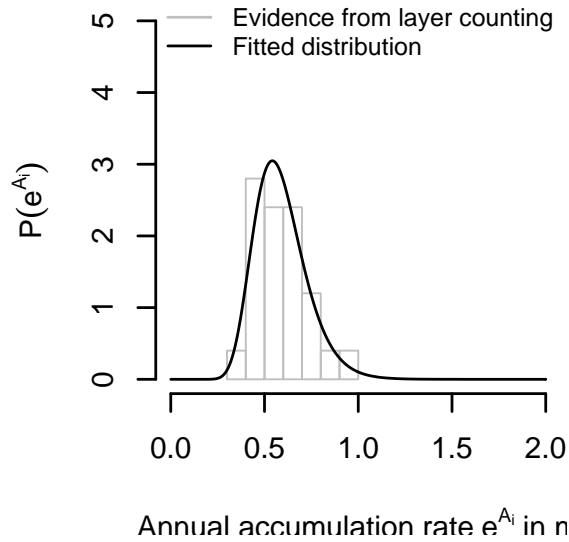
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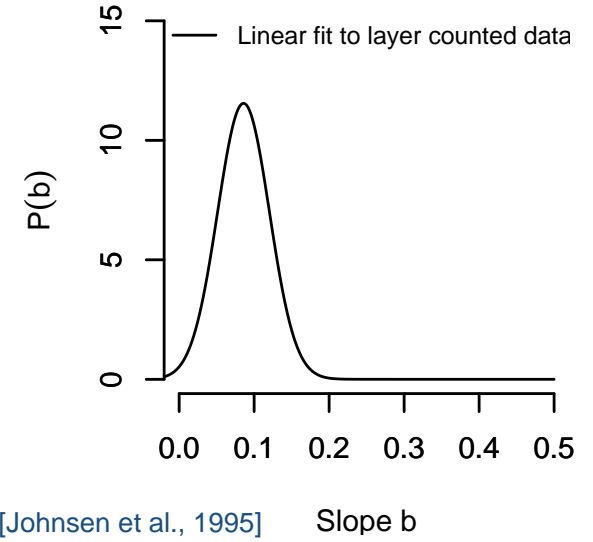
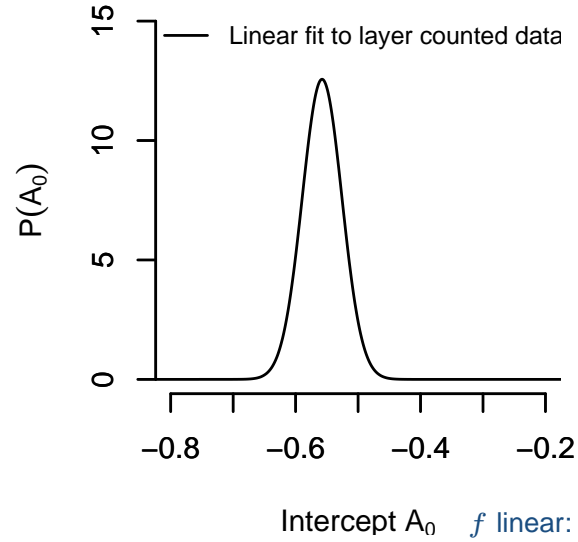
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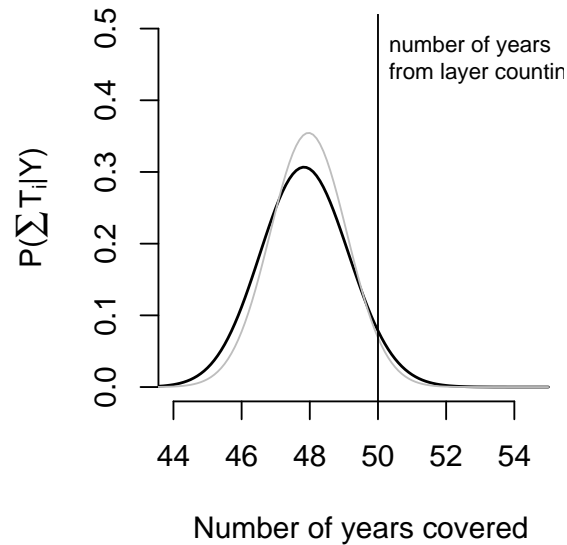
Accumulation prior



Model parameter priors



Dating uncertainty:
 47.9 ± 2.5 years





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- Current and Future Research

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Current and Future Research

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- Current and Future Research

- only excerpt of our work



Current and Future Research

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- Current and Future Research

- only excerpt of our work
- current research
 - gain better prior knowledge
 - include mechanical model and volcanic eruptions



Current and Future Research

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- Current and Future Research

- only excerpt of our work
- current research
 - gain better prior knowledge
 - include mechanical model and volcanic eruptions
- future research
 - more complex accumulation models f
 - multicore, multiproxy analysis
 - statistical approach for layer counting (pilot: J. Wheatley)
→ combine



Current and Future Research

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- only excerpt of our work
- current research
 - gain better prior knowledge
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 - more complex accumulation models f
 - multicore, multiproxy analysis
 - statistical approach for layer counting (pilot: J. Wheatley)
→ combine
- problems
 - hiatus: summer melting, ice flow disturbances
 - hard to quantify uncertainty further back in time



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Thank you!

Questions and comments ...

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- [Johnsen et al., 1995] Johnsen, S. J., Dahl-Jensen, D., Dansgaard, W., and Gundestrup, N. (1995). Greenland palaeotemperatures derived from GRIP bore hole temperature and ice core isotope profiles. Tellus B, 47(5):624–629.
- [Parrenin et al., 2007] Parrenin, F., Dreyfus, G., Durand, G., Fujita, S., Gagliardini, O., Gillet, F., Jouzel, J., Kawamura, K., Lhomme, N., Masson-Delmotte, V., Ritz, C., Schwander, J., Shoji, H., Uemura, R., Watanabe, O., and Yoshida, N. (2007). 1-d-ice flow modelling at EPICA Dome C and Dome Fuji, East Antarctica. Climate of the Past, 3(Special Issue: The EPICA (EDC and EDML) ice cores age scales):1961.