

# *The past and future of peak detection in paleofire research*

**Philip Higuera**

Professor of Fire Ecology

University of Montana

@PhilipHiguera

International Paleofire Network

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# The past and future of peak detection

1. **Origin and development** of peak-detection methods
2. **Principles** of the decomposition approach and *CharAnalysis*
3. **Best practices and potential pitfalls** using peak detection to infer and interpret fire occurrence
4. **Future needs and opportunities**

\*This will be fast...and I will skip things!

*International Journal of Wildland Fire* **2010**, 19, 996–1014

## **Peak detection in sediment–charcoal records: impacts of alternative data analysis methods on fire-history interpretations**

*Philip E. Higuera<sup>A,E</sup>, Daniel G. Gavin<sup>B</sup>, Patrick J. Bartlein<sup>B</sup>  
and Douglas J. Hallett<sup>C,D</sup>*

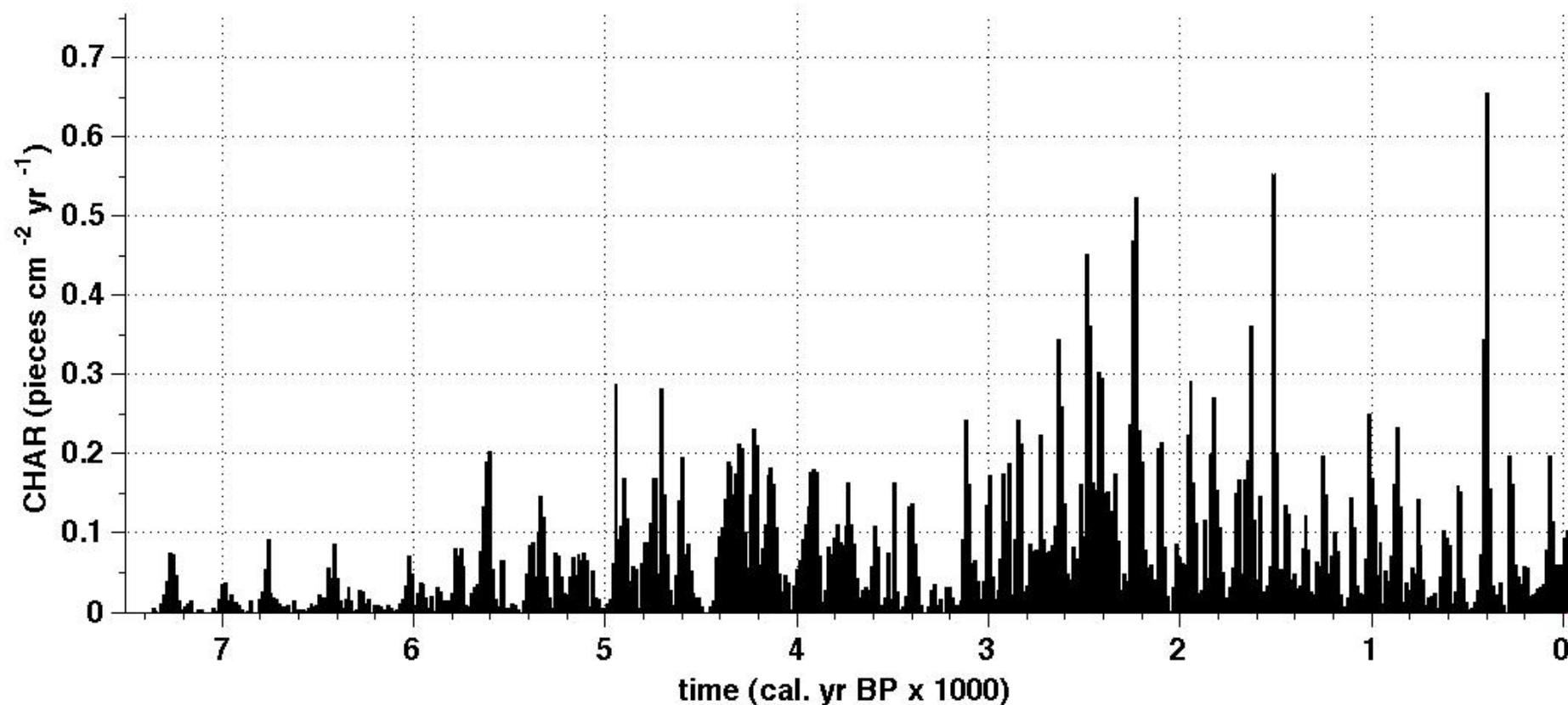


**“Even when applying the most rigorous analytical techniques, there is no substitute for careful inspection of a record to assess whether it can provide an unbiased fire history in the first place.”**

**– Higuera et al. (2010)**

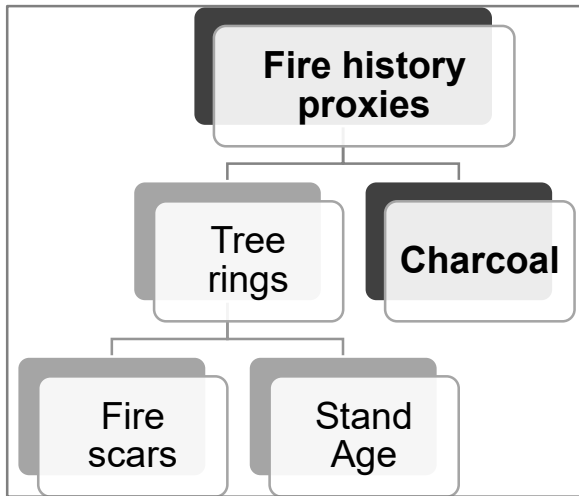
# 1. Origins and development

**Peak detection: identifying charcoal “peaks” that are interpreted as individual fires or fire events; performed when the goal is to reconstruct “local” fire history.**

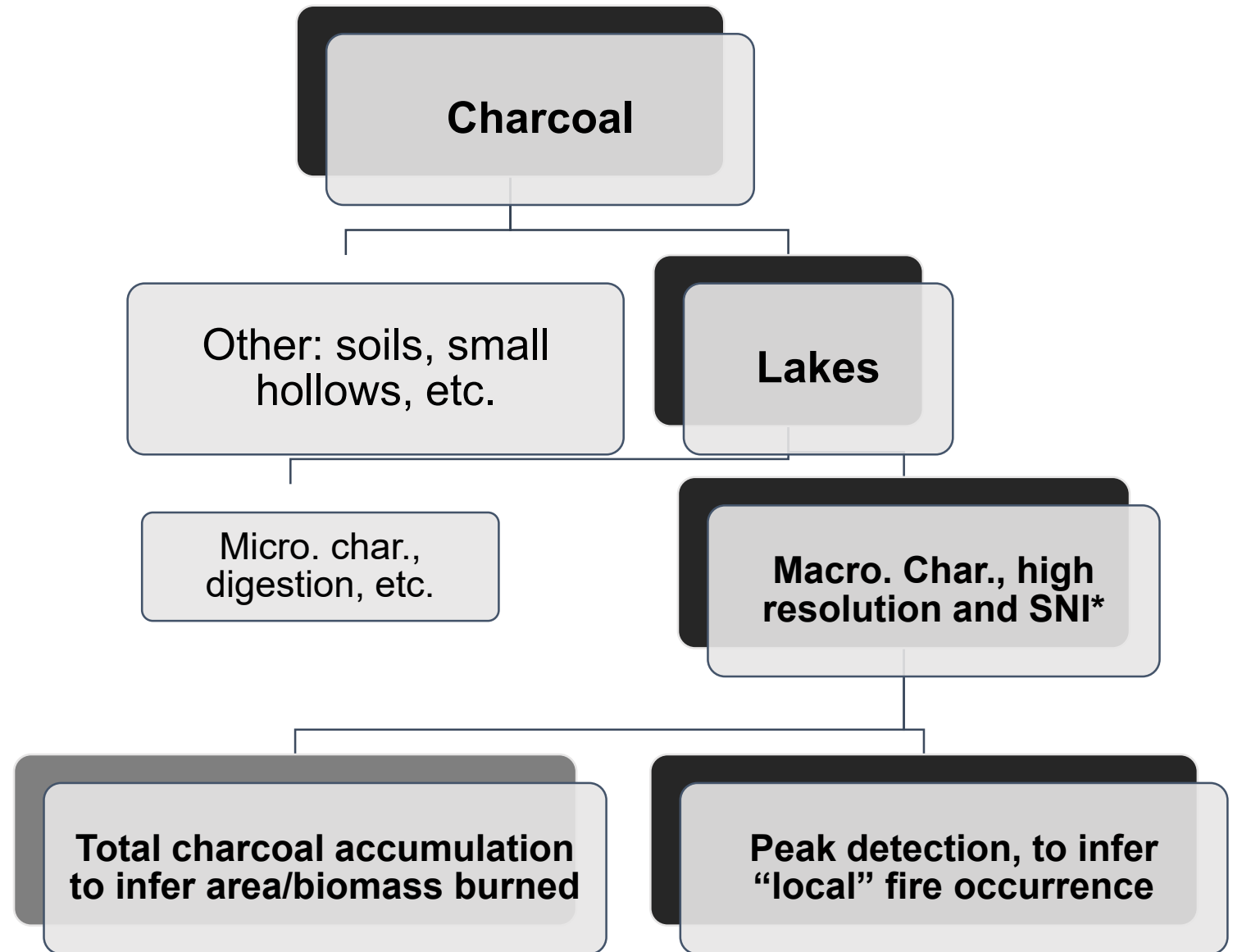




# 1. Origins and development

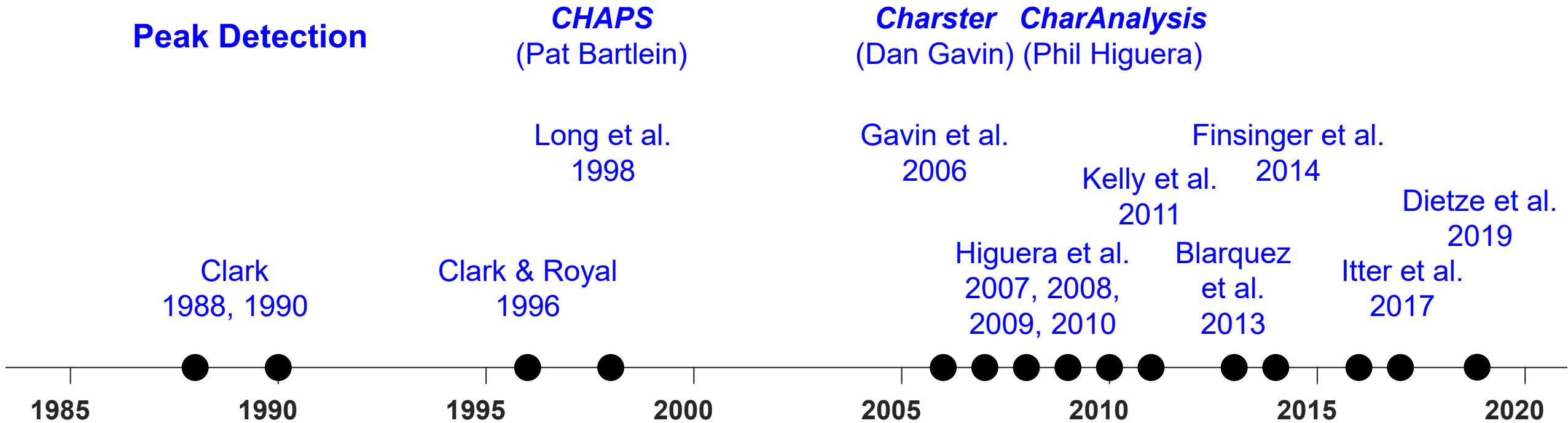


*Peak detection is just one of many approaches used to infer fire history in paleo records*



\*SNI: signal-to-noise index, Kelly et al. (2011)

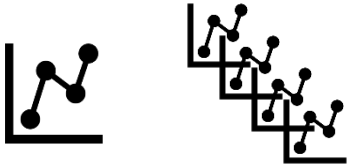
# 1. Origins and development



This is NOT a complete list; this highlights “first” papers introducing new peak-analysis methods, and/or significant advances.

# 1. Origins and development

## Peak Detection



## CHAPS (Pat Bartlein)

Long et al.  
1998

## Charster CharAnalysis (Dan Gavin) (Phil Higuera)

Gavin et al.  
2006

Kelly et al. 2011  
Finsinger et al. 2014

Dietze et al.  
2019

Clark  
1988, 1990

Clark & Royal  
1996

Higuera et al.  
2007, 2008,  
2009, 2010

Blarquez  
et al.  
2013

Itter et al.  
2017

1985

1990

1995

2000

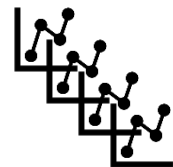
2005

2010

2015

2020

## Synthesis of CHAR time series



Marlon et al.,  
Power et al.  
2008

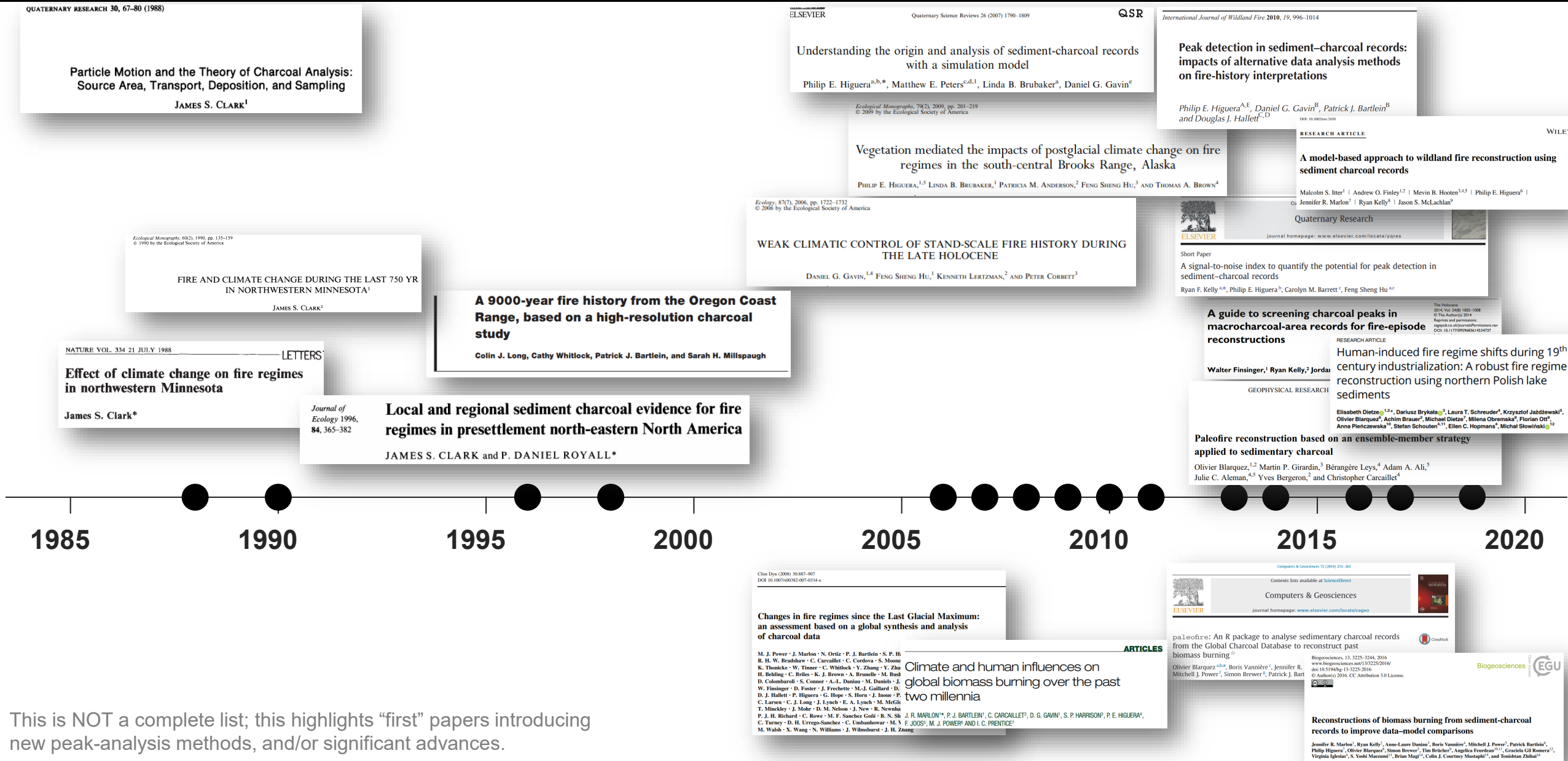
Blarquez  
et al.  
2014

Marlon  
et al.  
2016

paleofire  
(Olivier Blarquez)



# 1. Origins and development



- Blarquez, O., M. P. Girardin, B. Leys, A. A. Ali, J. C. Aleman, Y. Bergeron, and C. Carcaillet. 2013. Paleofire reconstruction based on an ensemble-member strategy applied to sedimentary charcoal. *Geophysical Research Letters* 40:2667-2672. <https://doi.org/10.1002/grl.50504>
- Blarquez, O., B. Vannière, J. R. Marlon, A.-L. Daniau, M. J. Power, S. Brewer, and P. J. Bartlein. 2014. paleofire: An R package to analyze sedimentary charcoal records from the Global Charcoal Database to reconstruct past biomass burning. *Computers & Geosciences* 72:255-261. <http://dx.doi.org/10.1016/j.cageo.2014.07.020>
- Clark, J. S. 1988. Effects of climate change on fire regimes in northwestern Minnesota. *Nature* 334:233-235. <https://www.nature.com/articles/334233a0>
- Clark, J. S. 1988. Particle motion and the theory of charcoal analysis: source area, transport, deposition, and sampling. *Quaternary Research* 30:67-80. [https://doi.org/10.1016/0033-5894\(88\)90088-9](https://doi.org/10.1016/0033-5894(88)90088-9)
- Clark, J. S. 1990. Fire and climate change during the last 750 yr in northwestern Minnesota. *Ecological Monographs* 60:135-159. <https://doi.org/10.2307/1943042>
- Clark, J. S., and P. D. Royall. 1996. Local and regional sediment charcoal evidence for fire regimes in presettlement north-eastern North America. *Journal of Ecology* 84:365-382. <https://www.jstor.org/stable/pdf/2261199.pdf>
- Dietze, E., D. Brykala, L. T. Schreuder, K. Jazdzewski, O. Blarquez, A. Brauer, M. Dietze, M. Obremska, F. Ott, A. Pienczewska, et al. 2019. Human-induced fire regime shifts during 19th century industrialization: A robust fire regime reconstruction using northern Polish lake sediments. *PLoS ONE* 14:e0222011. <https://doi.org/10.1371/journal.pone.0222011>
- Finsinger, W., R. Kelly, J. Fevre, and E. K. Magyari. 2014. A guide to screening charcoal peaks in macrocharcoal-area records for fire-episode reconstructions. *The Holocene* 24:1002-1008. <https://doi.org/10.1177%2F0959683614534737>
- Gavin, D. G., F. S. Hu, K. Lertzman, and P. Corbett. 2006. Weak climatic control of stand-scale fire history during the late Holocene. *Ecology* 87:1722-1732. [https://doi.org/10.1890/0012-9658\(2006\)87\[1722:WCCOSF\]2.0.CO;2](https://doi.org/10.1890/0012-9658(2006)87[1722:WCCOSF]2.0.CO;2)
- Higuera, P. E., L. B. Brubaker, P. M. Anderson, T. A. Brown, A. T. Kennedy, and F. S. Hu. 2008. Frequent Fires in Ancient Shrub Tundra: Implications of Paleorecords for Arctic Environmental Change. *PLoS ONE* 3:e0001744. <https://doi.org/10.1371/journal.pone.0001744>
- Higuera, P. E., L. B. Brubaker, P. M. Anderson, F. S. Hu, and T. A. Brown. 2009. Vegetation mediated the impacts of postglacial climate change on fire regimes in the south-central Brooks Range, Alaska. *Ecological Monographs* 79:201-219. <https://doi.org/10.1890/07-2019.1>
- Higuera, P. E., D. G. Gavin, P. J. Bartlein, and D. J. Hallett. 2010. Peak detection in sediment-charcoal records: impacts of alternative data analysis methods on fire-history interpretations. *International Journal of Wildland Fire* 19:996-1014. <https://doi.org/10.1071/WF09134>
- Higuera, P. E., M. E. Peters, L. B. Brubaker, and D. G. Gavin. 2007. Understanding the origin and analysis of sediment-charcoal records with a simulation model. *Quaternary Science Reviews* 26:1790-1809. <https://doi.org/10.1016/j.quascirev.2007.03.010>
- Itter, M. S., A. O. Finley, M. B. Hooten, P. E. Higuera, J. R. Marlon, R. Kelly, and J. S. McLachlan. 2017. A model-based approach to wildland fire reconstruction using sediment charcoal records. *Environmetrics*:e2450. <https://doi.org/10.1002/env.2450>
- Kelly, R. F., P. E. Higuera, C. M. Barrett, and F. S. Hu. 2011. A signal-to-noise index to quantify the potential for peak detection in sediment-charcoal records. *Quaternary Research* 75:11-17. <https://doi.org/10.1016/j.yqres.2010.07.011>
- Long, C. J., C. Whitlock, P. J. Bartlein, and S. H. Millsaugh. 1998. A 9000-year fire history from the Oregon Coast Range, based on a high-resolution charcoal study. *Canadian Journal of Forest Research* 28:774-787. <https://doi.org/10.1139/x98-051>
- Marlon, J. R., P. J. Bartlein, C. Carcaillet, D. G. Gavin, S. P. Harrison, P. E. Higuera, F. Joos, M. J. Power, and I. C. Prentice. 2008. Climate and human influences on global biomass burning over the past two millennia. *Nature Geoscience* 1:697-702. <https://www.nature.com/articles/ngeo313>
- Power, M. J., J. Marlon, N. Ortiz, P. J. Bartlein, S. P. Harrison, F. E. Mayle, A. Ballouche, R. H. W. Bradshaw, C. Carcaillet, C. Cordova, et al. 2008. Changes in fire regimes since the Last Glacial Maximum: an assessment based on a global synthesis and analysis of charcoal data. *Climate Dynamics* 30:887-907. <https://link.springer.com/article/10.1007/s00382-007-0334-x>

# 1. Origins and development

*Peak detection is best suited for high-severity fire regimes*

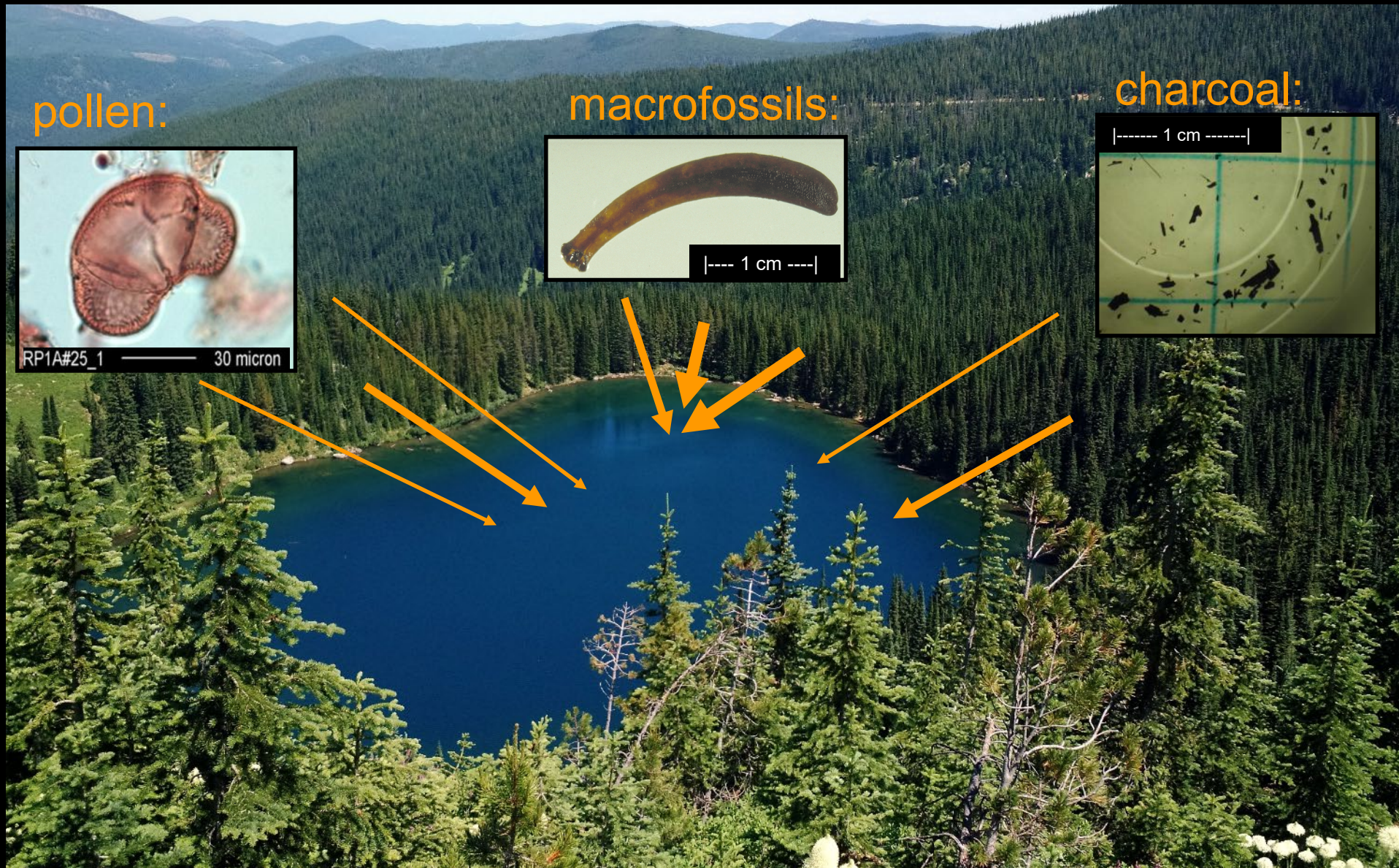


**“Identifying fire episodes from charcoal records is most promising when fires:**  
(1) are large [relative to the charcoal source area];  
(2) burn with high severity; and  
(3) recur with average intervals at least five times the sampling resolution of the sediment record (Clark 1988b; Whitlock and Larsen 2001; Higuera et al. 2005, 2007).**”**

**Sediment–charcoal records are thus particularly valuable for studying stand-replacing fire regimes in boreal and subalpine forests, where all three of these conditions are typically met.”** - Higuera et al. (2010)



## 2. Principles of decomposition and *CharAnalysis*



Missoula Lake, Lolo National Forest, Montana (P. Higuera)



# Charcoal comes from fire, primarily from airborne deposition

## Charcoal production varies within and between fires



Charcoal floating on a lake surface days after a boreal forest fire in Alaska.



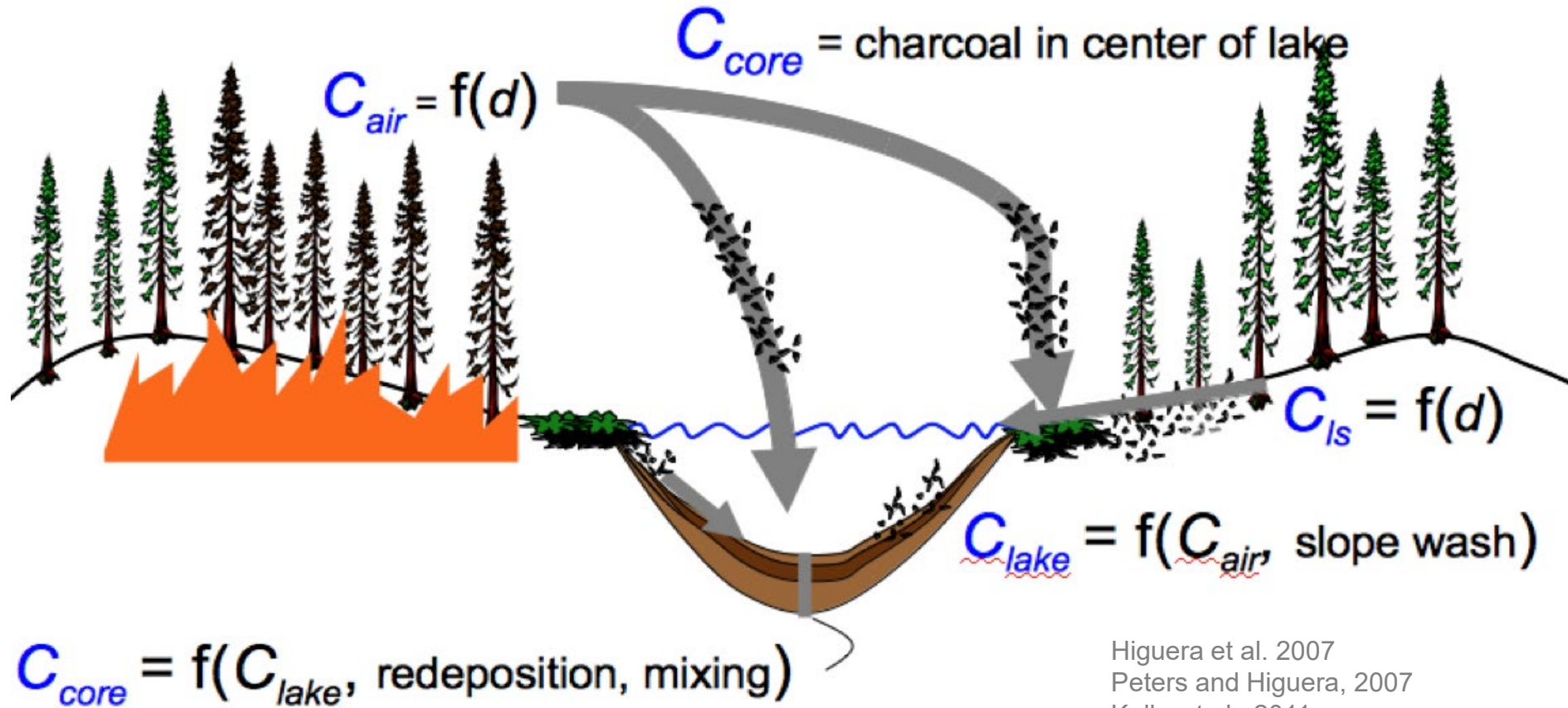
Crown-fire in a high-elevation (subalpine) forest in Yellowstone NP, characterized historically by a high-severity fire regimes (photo: NPS).



Surface-fire in a low-elevation (montane) forest in the N. Rockies, characterized historically by a low-severity fire regimes. .

Amount of charcoal depends on charcoal production, distance, injection height, & wind

Slope wash, within-lake redeposition, and mixing “blur” record

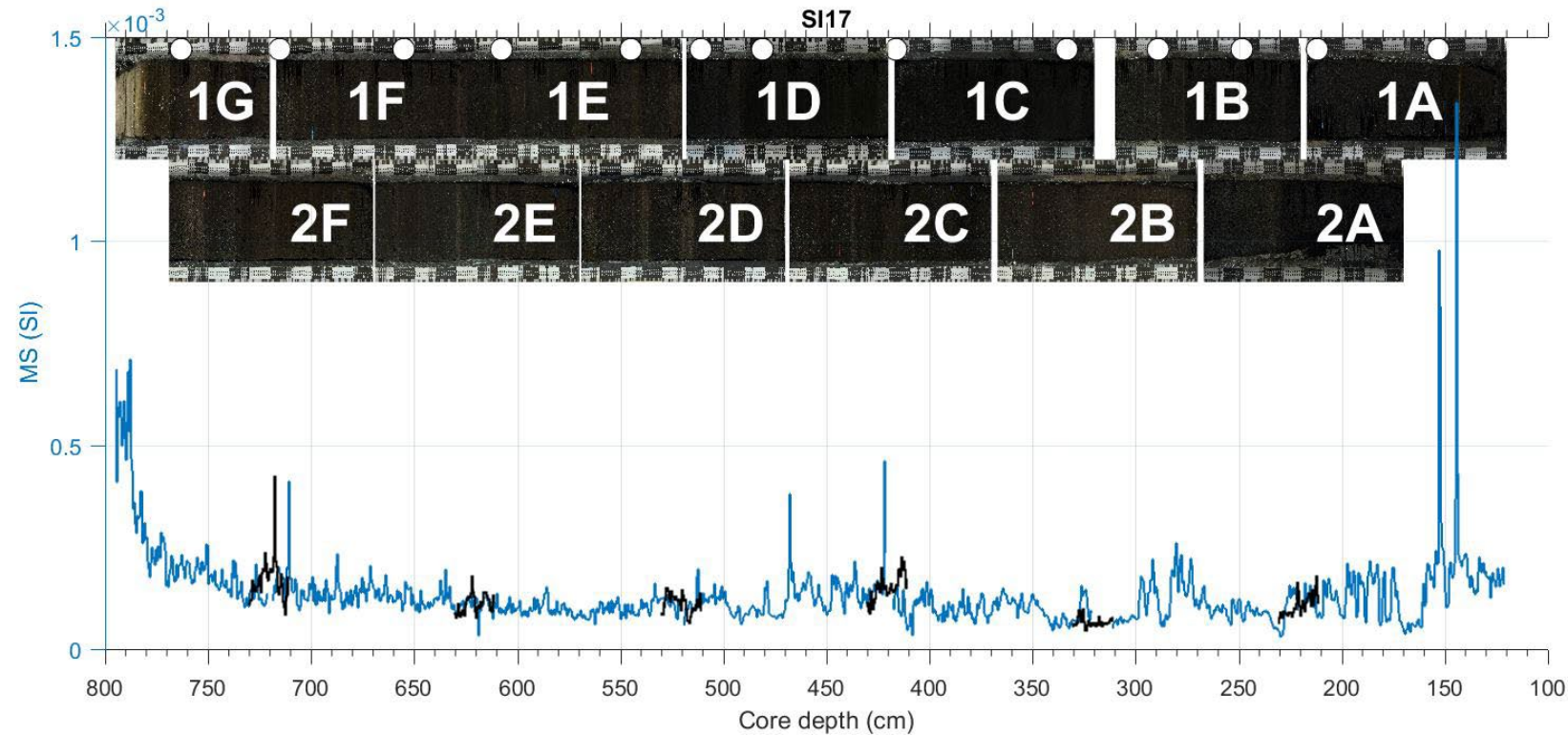
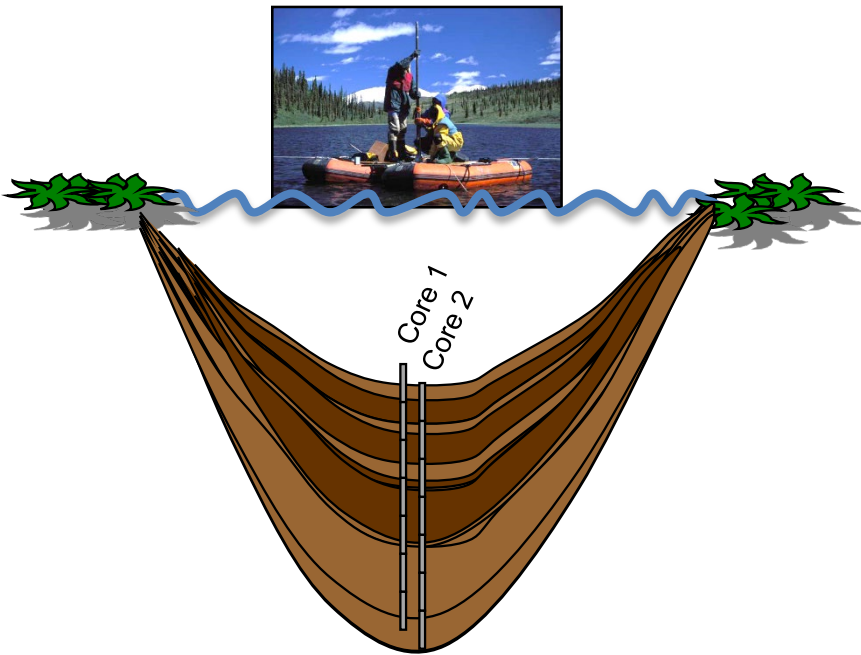


Higuera et al. 2007  
Peters and Higuera, 2007  
Kelly, et al., 2011

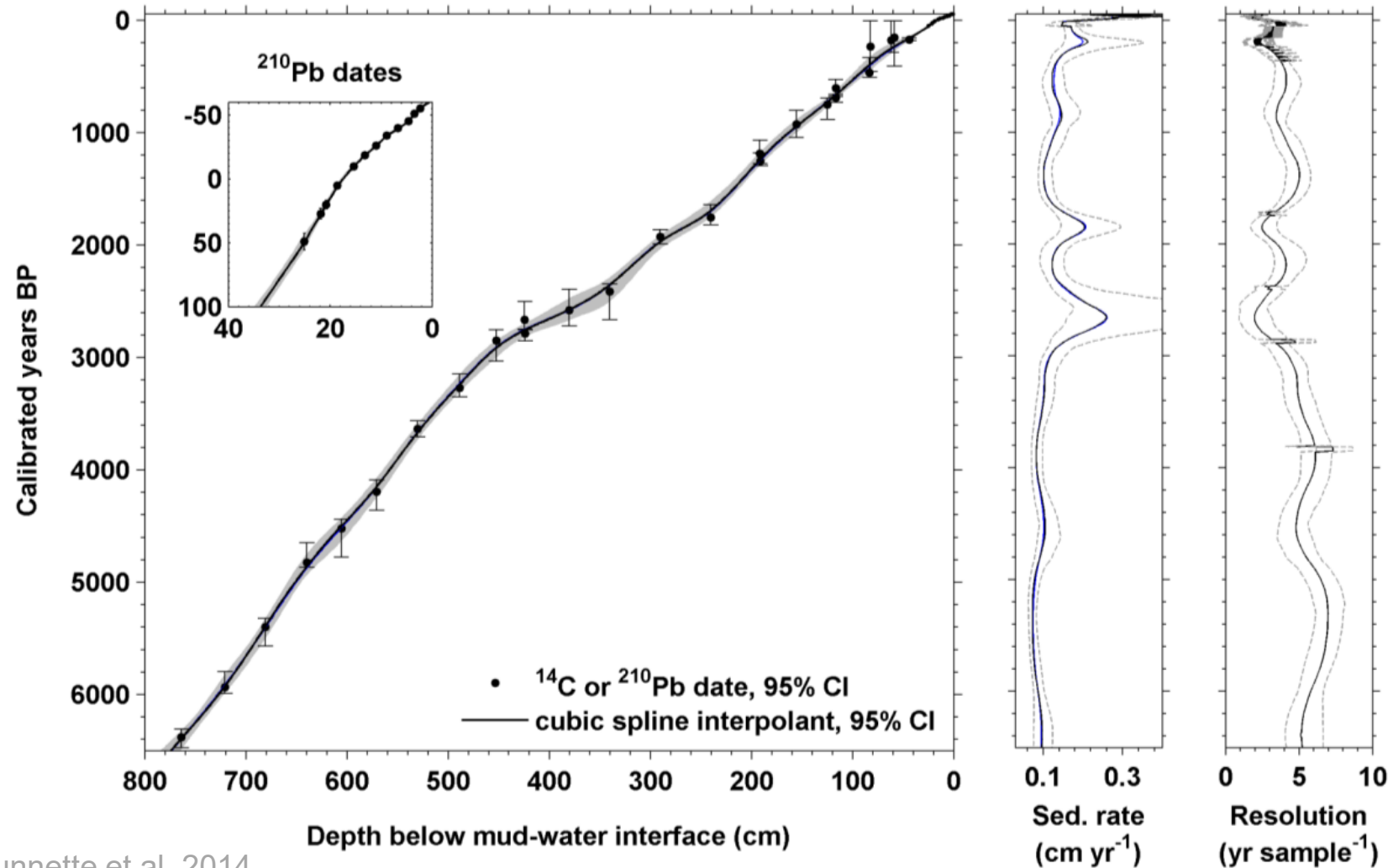


**Small, deep lakes with small or no inlet maximize resolution, and minimize charcoal source area:**

**Because fire events are discrete, parallel cores and contiguous sampling needed to provide a continuous record:**



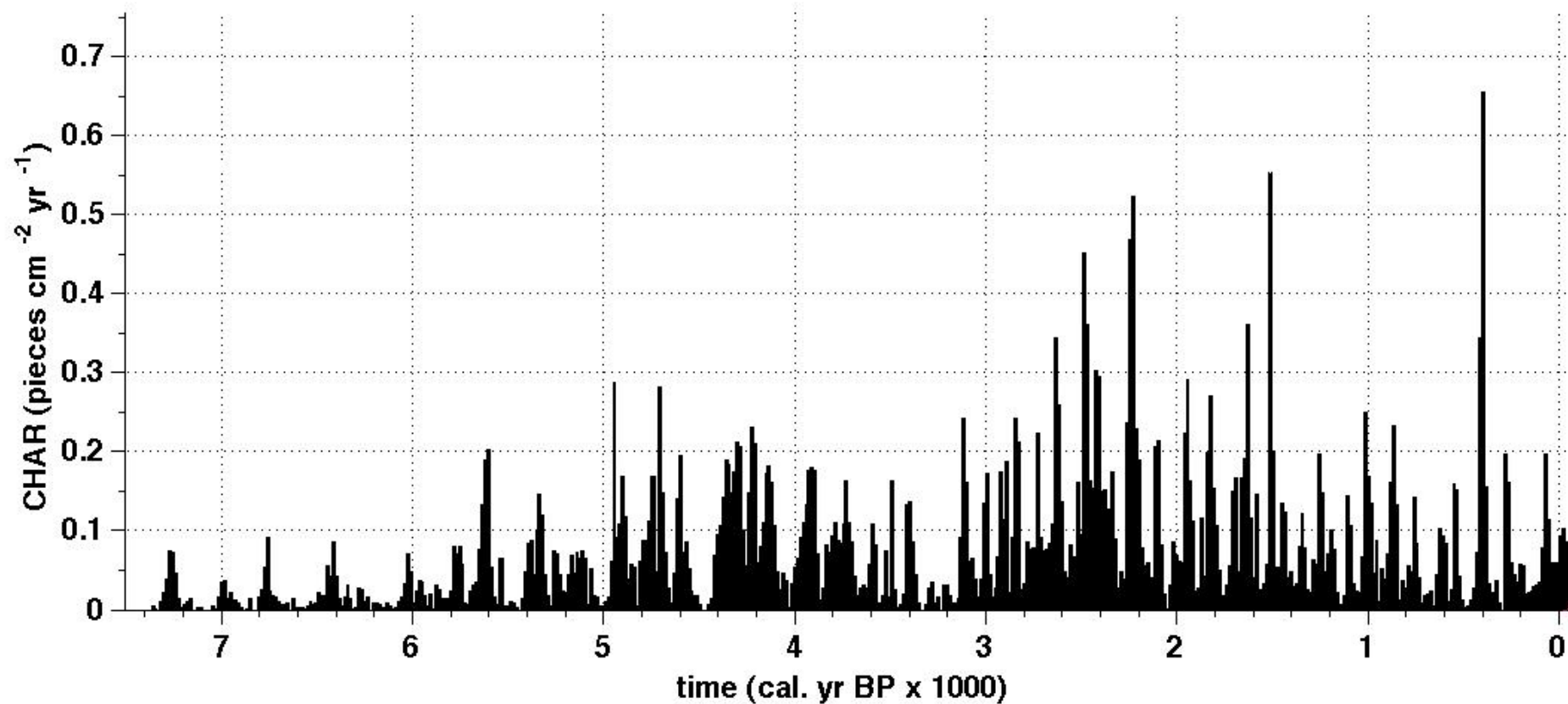
# High-resolution, well-dated record necessary (i.e., 1/5 expected mean fire return intervals )



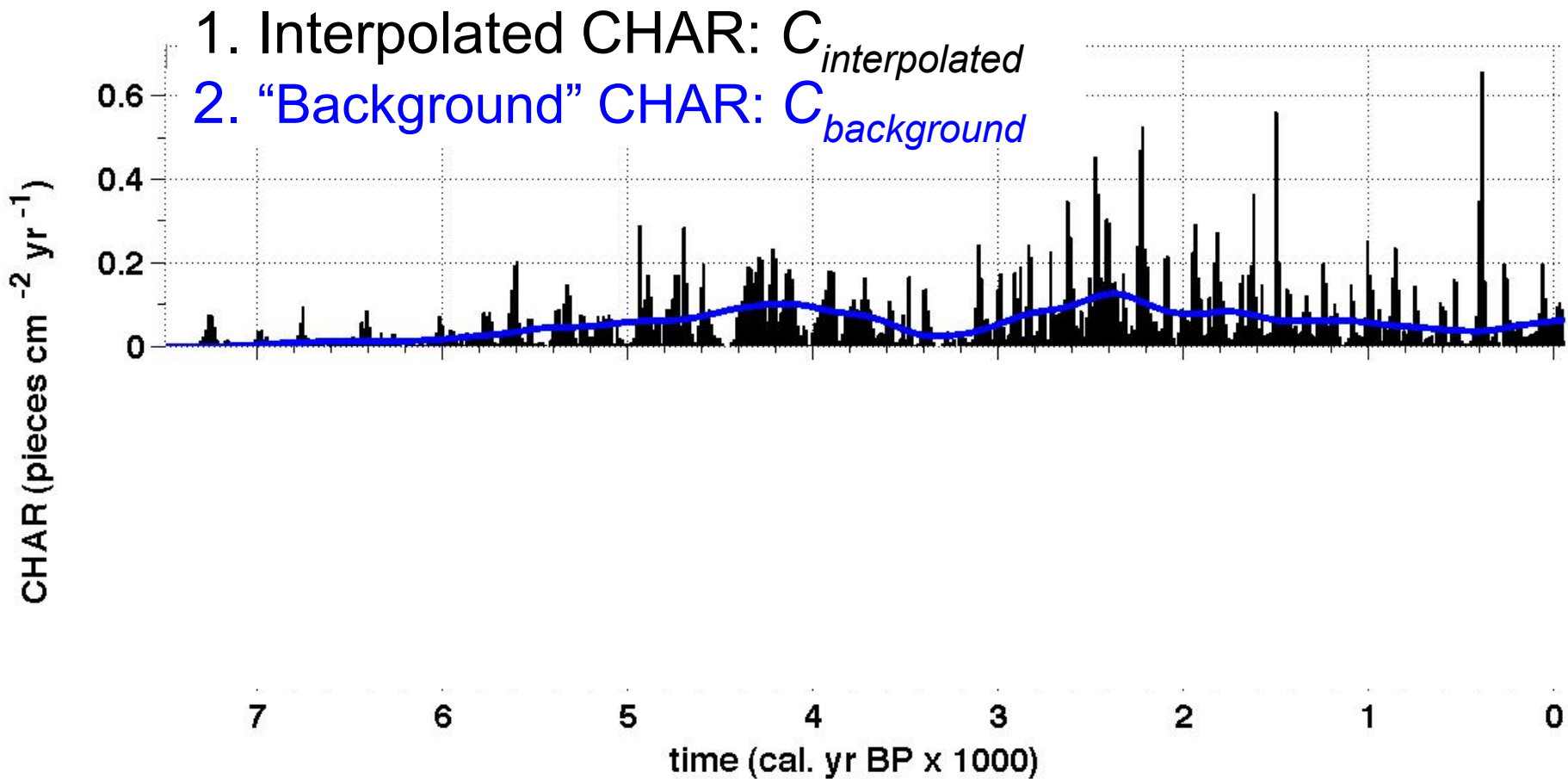


# “Decomposition” approach

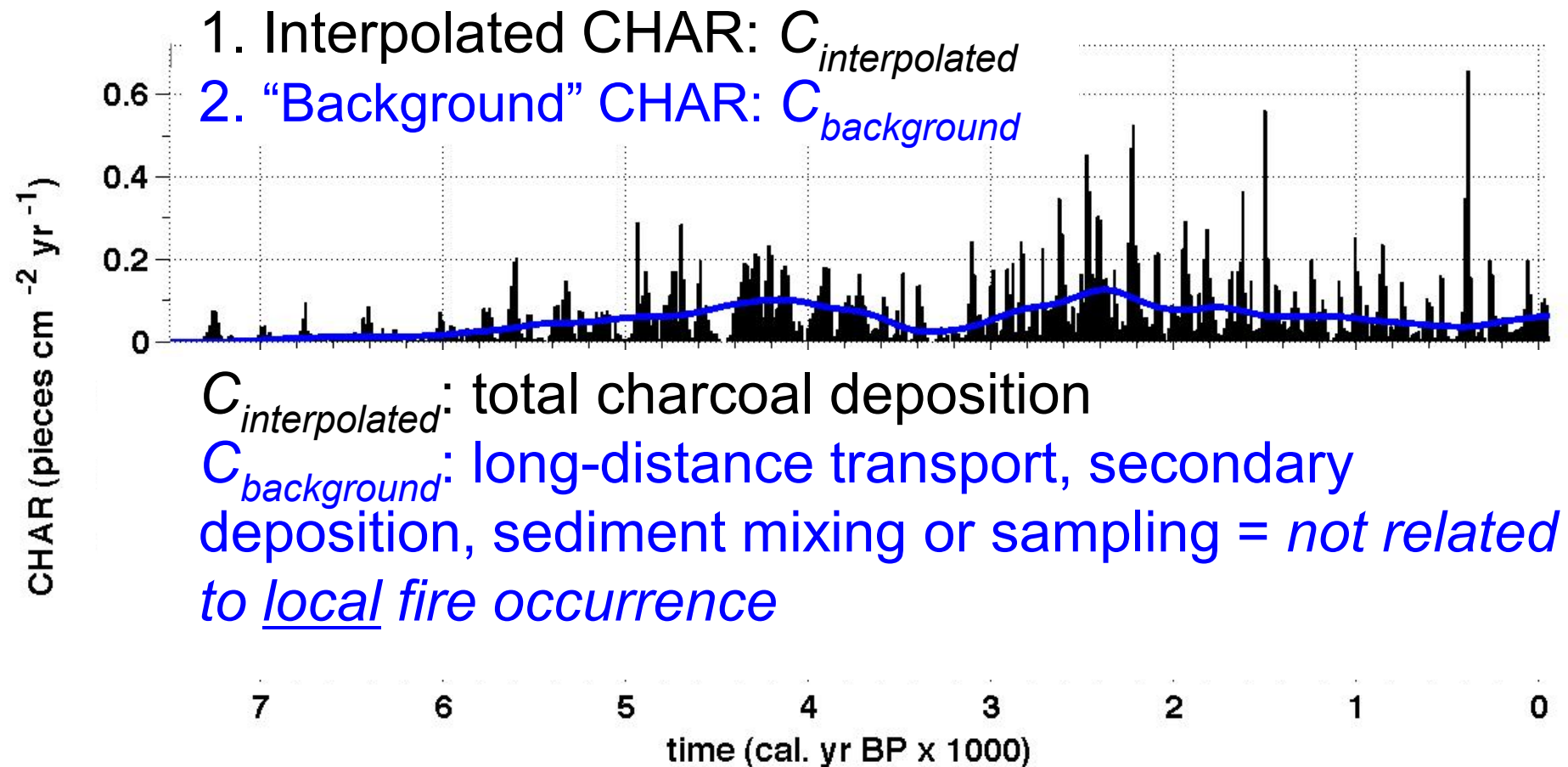
How many peaks are in this record?



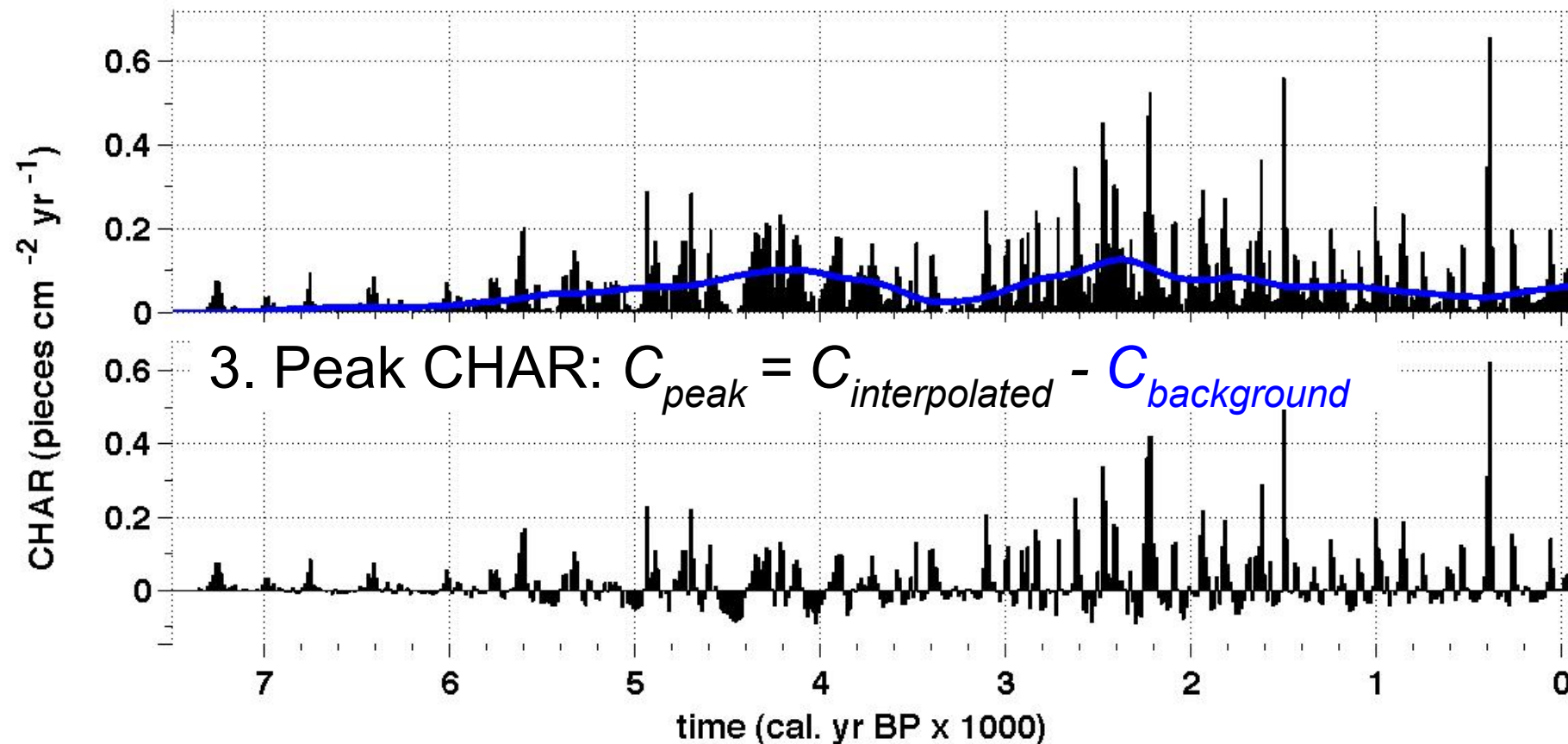
# Charcoal records contain two sources of information: low- and high-frequency variability



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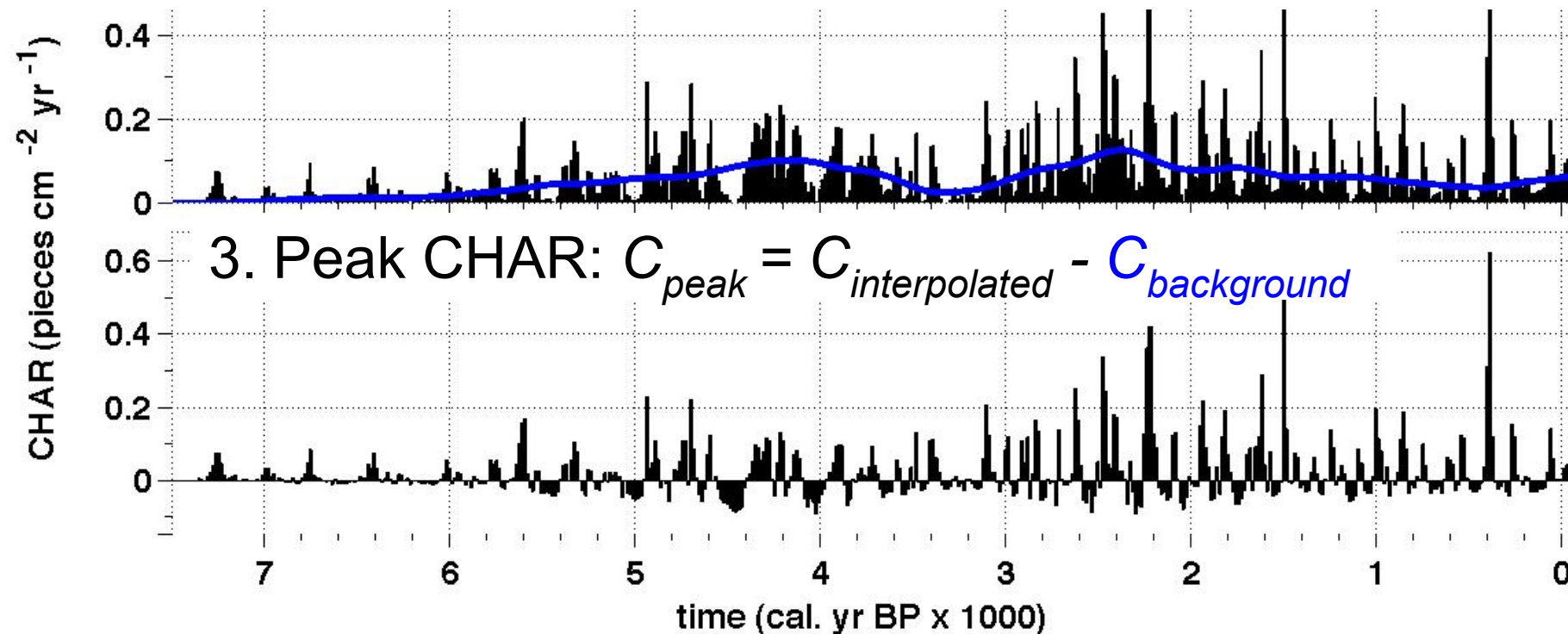
# Charcoal records contain two sources of information: low- and high-frequency variability



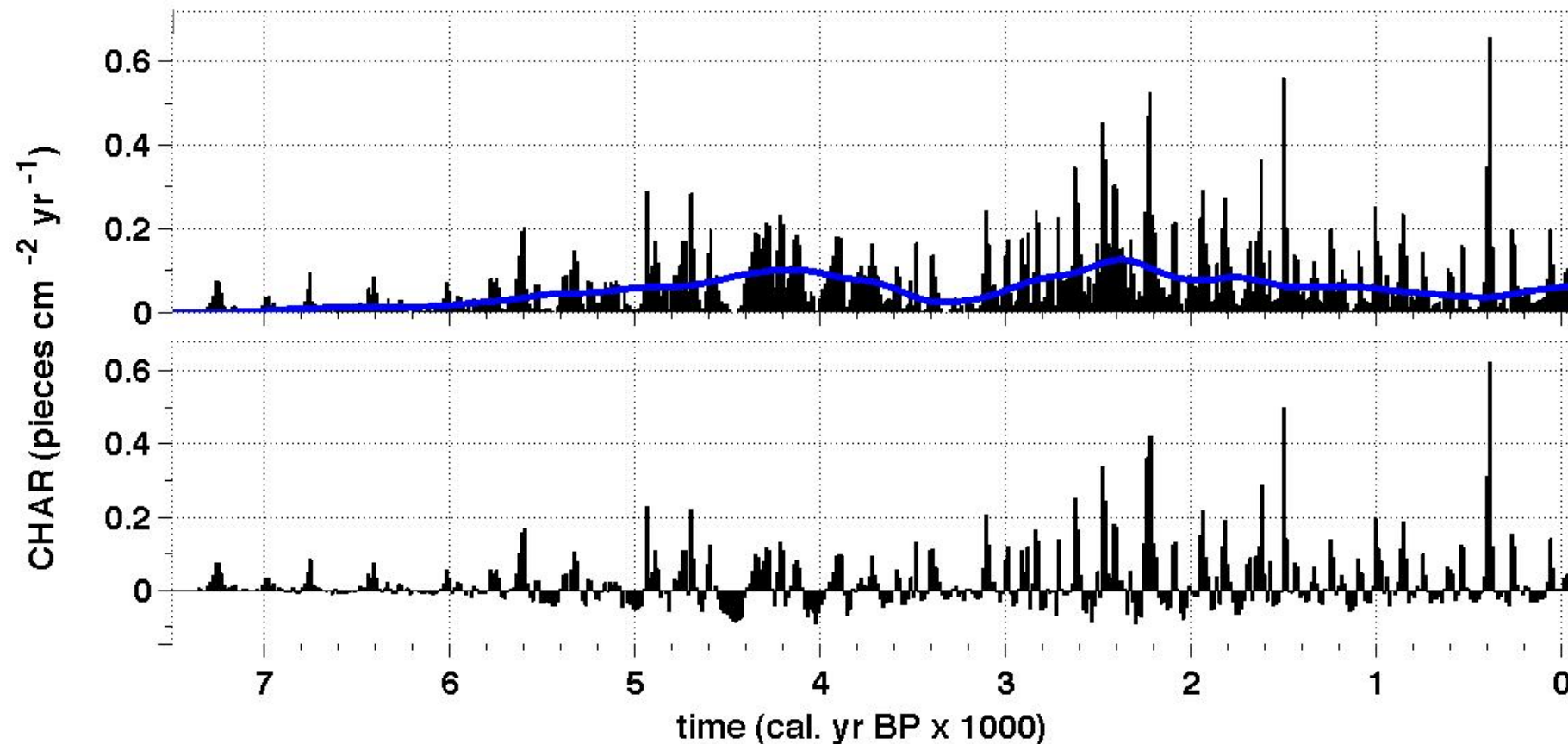


# Charcoal records contain two sources of information: low- and high-frequency variability

$C_{peak}$ : high-frequency variability; background removed.  
Includes signal from local fires, plus noise.

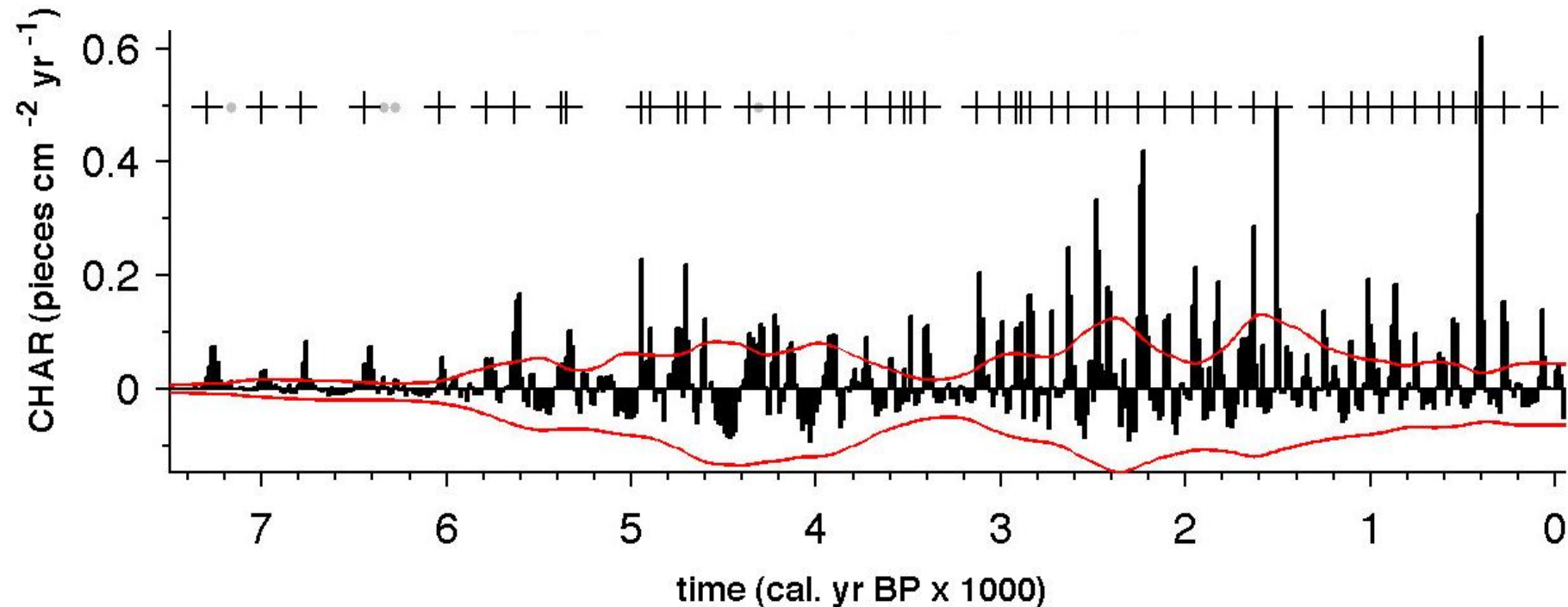


**Goal of decomposition is to isolate signal of local fires from “noise” of distant fires, natural variability, and analytical variability**

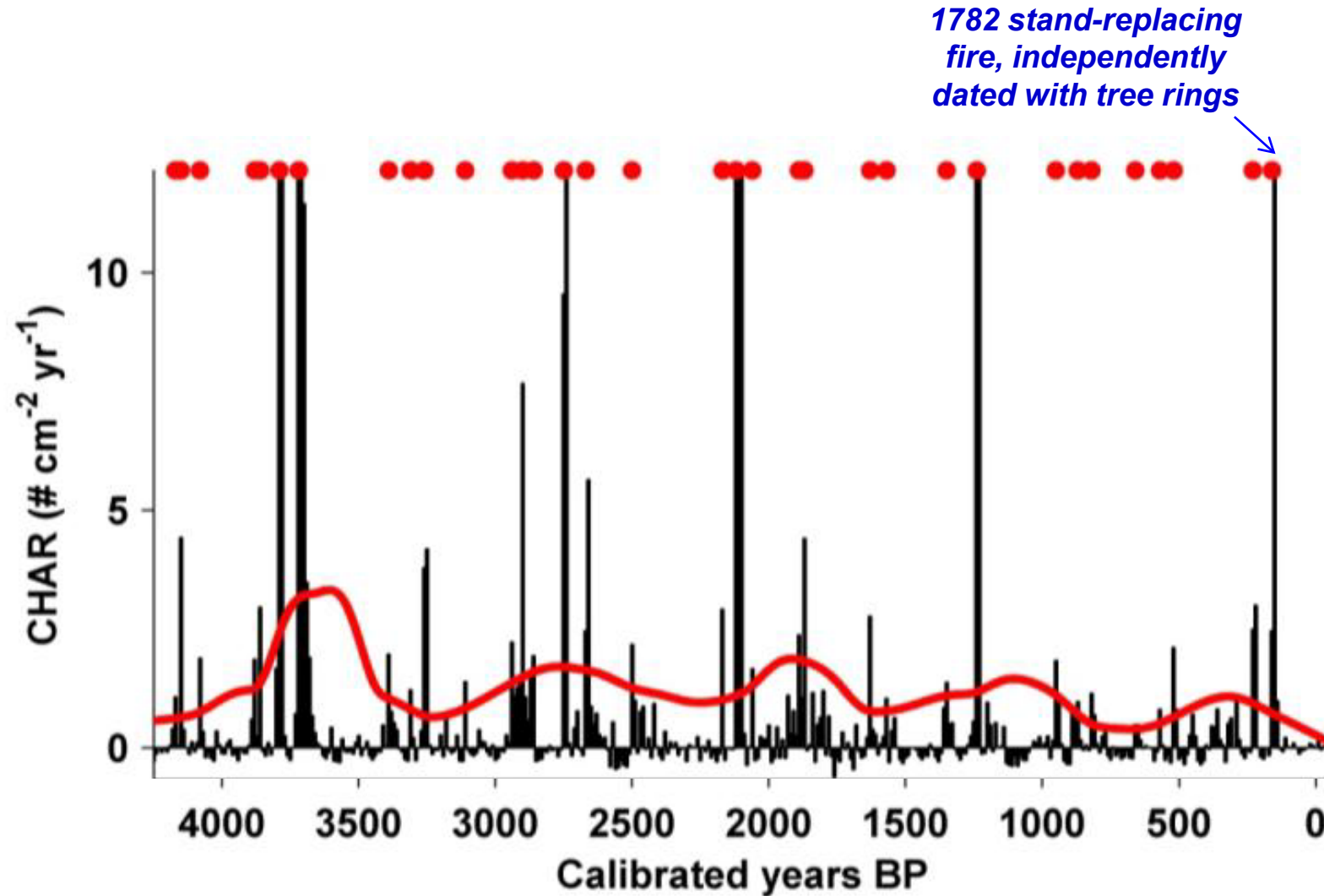


**Varying threshold techniques are used to quantify the “noise” around background variability.**

**“Local” threshold methods respond to variability in background and peak size**

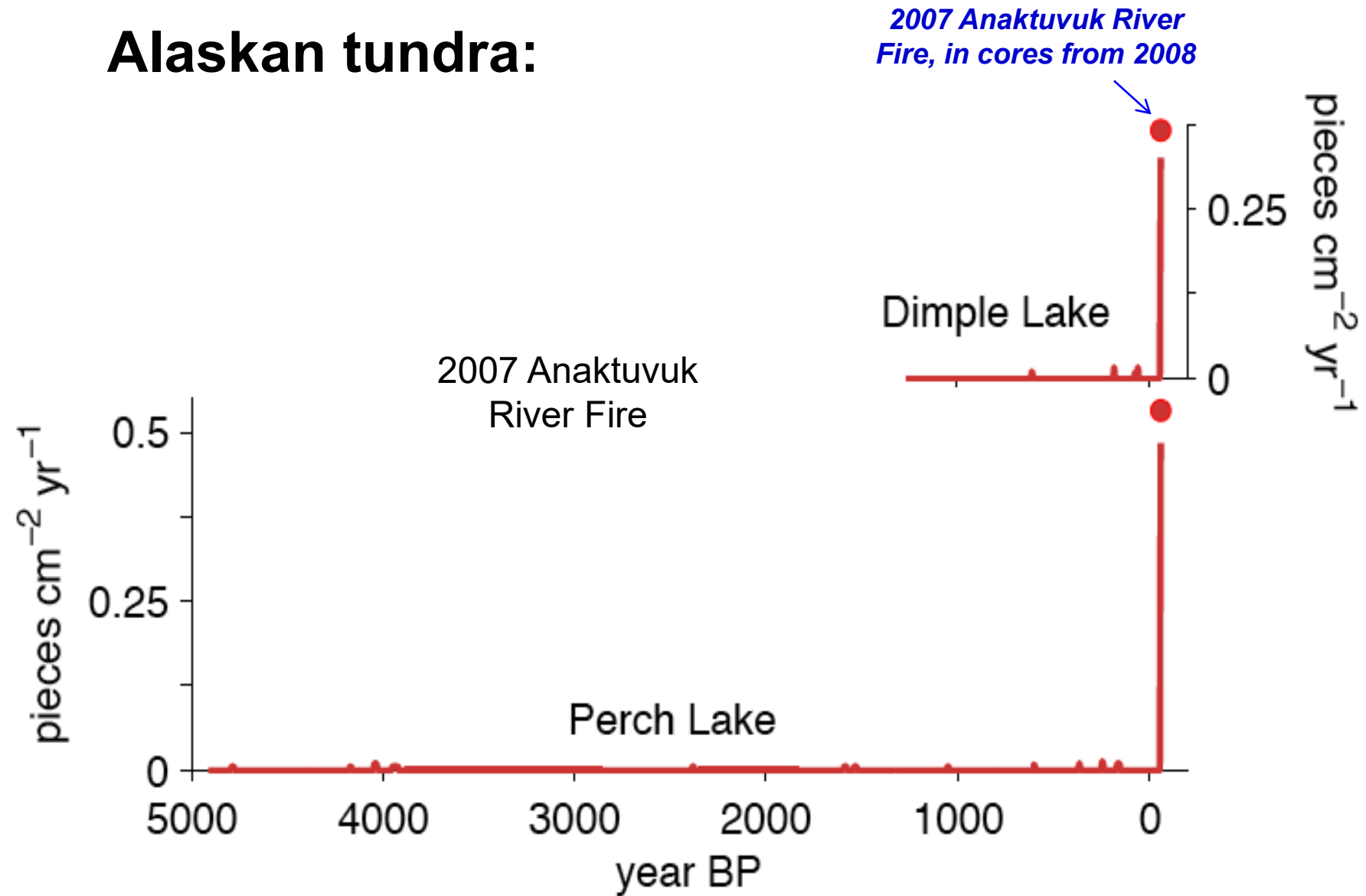


# Chickaree Lake, Colorado subalpine forest:





# Alaskan tundra:



# CharAnalysis - tools to implement peak detection

<https://github.com/phiguera/CharAnalysis>

[View on GitHub](#)

## CharAnalysis

Diagnostic and analytical tools for sediment-charcoal analysis

[tar.gz](#) [.zip](#)

### CharAnalysis: Diagnostic and analytical tools for sediment-charcoal analysis

*CharAnalysis* is a program for analyzing sediment-charcoal records, when the goal is peak detection to reconstruct “local” fire history. Diagnostic tools help determine if peak detection is warranted, and if so, what parameters are most reasonable. Analytical tools help summarize results statistically and graphically. The entire code is distributed and well commented. Users are encouraged to “look under the hood”, understand what’s going on, and modify the program to suit individual needs.

(c) 2004-2021


Philip Higuera

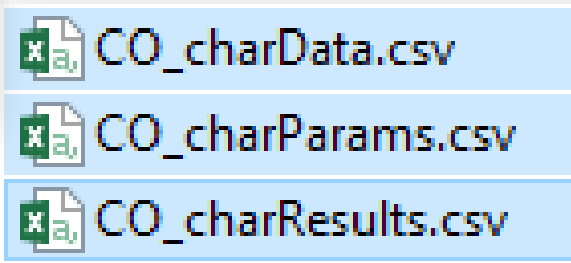
Professor of Fire Ecology

Department of Ecosystem and Conservation Sciences

University of Montana

<http://www.cfc.umt.edu/phiguera/>

|   |                             |  |              |
|---|-----------------------------|--|--------------|
|  | phiguera Update README.md   | 9bd9009 18 hours ago                     | 🕒 22 commits |
| 📁   | CharAnalysis_1_1_MATLAB     | Updated to accommodate short records     | 4 years ago  |
| 📁   | CharAnalysis_1_1_Windows    | Update readme_CharAnalysis_standAlone.md | 3 years ago  |
| 📄   | CO_charData.csv             | First commit                             | 7 years ago  |
| 📄   | CO_charParams.csv           | First commit                             | 7 years ago  |
| 📄   | CO_charResults.csv          | First commit                             | 7 years ago  |
| 📄   | COchar.xls                  | First commit                             | 7 years ago  |
| 📄   | CharAnalysis_UsersGuide.pdf | Restructured directories                 | 7 years ago  |
| 📄   | README.md                   | Update README.md                         | 18 hours ago |
| 📄   | index.html                  | Update index.html                        | 18 hours ago |
| 📄   | templateChar.xls            | First commit                             | 7 years ago  |
| 📄   | template_charData.csv       | First commit                             | 7 years ago  |
| 📄   | template_charParams.csv     | First commit                             | 7 years ago  |

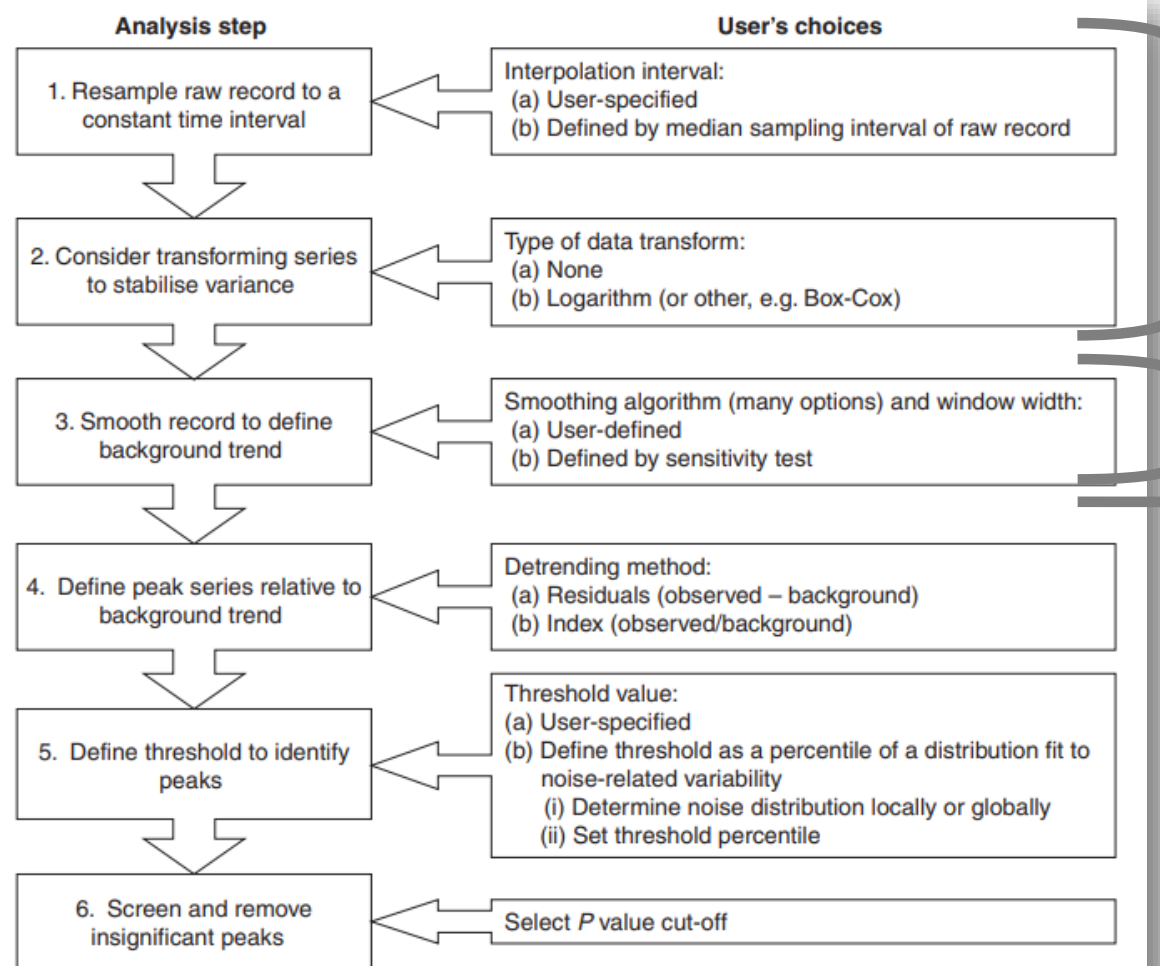


--- input charcoal data

--- parameters to use for analysis

--- output – results from *CharAnalysis*

# User decisions in *CharAnalysis* directly map to the theory of peak analysis



**Fig. 1.** The set of decisions required for analysing a charcoal time series with the goal of peak detection for interpretation of fire episodes. These steps are implemented in the *CharAnalysis* software (<http://code.google.com/p/charanalysis/>, accessed 30 November 2010).

CO\_charParams.csv

|    | A                     | B                       | C          | D           | E                             | F |
|----|-----------------------|-------------------------|------------|-------------|-------------------------------|---|
| 1  | Stage                 | Variable                | Parameters | Units       | Description and Options       |   |
| 2  | Pretreatment          | zoneDiv                 | -51        | cal. yr BP  | Years defining beginning at   |   |
| 3  |                       |                         | 5500       |             | *NOTE: YOU MUST INPUT         |   |
| 4  |                       |                         | 7500       |             | *NOTE: YOU MUST INPUT         |   |
| 5  |                       |                         | -9999      |             | *NOTE: YOU MUST INPUT         |   |
| 6  |                       |                         | -9999      |             | *NOTE: YOU MUST INPUT         |   |
| 7  |                       |                         | -9999      |             | *NOTE: YOU MUST INPUT         |   |
| 8  |                       |                         | -9999      |             | *NOTE: YOU MUST INPUT         |   |
| 9  |                       |                         | -9999      |             | *NOTE: YOU MUST INPUT         |   |
| 10 |                       | yrInterpolate           | 15         | yr          | Years to interpolate record   |   |
| 11 |                       | transform               | 0          | index       | Do you want to transform th   |   |
| 12 | Smoothing             | method                  | 4          | index       | How do you want to estimat    |   |
| 13 |                       | yr                      | 500        | yr          | Years to smooth record ove    |   |
| 14 | Peak Analysis         | cPeak                   | 1          | index       | How do you want to calcula    |   |
| 15 |                       | threshType              | 2          | index       | What type of threshold do y   |   |
| 16 |                       | threshMethod            | 3          | index       | How do you want to determi    |   |
| 17 |                       | threshValues            | 0.95       | variable    | What threshold values do y    |   |
| 18 |                       |                         | 0.99       |             |                               |   |
| 19 |                       |                         | 0.999      |             |                               |   |
| 20 |                       |                         | 0.99       |             |                               |   |
| 21 |                       | minCountP               | 0.05       | probability | Cut-off probability for minin |   |
| 22 | Peak Analysis Results | peakFreque              | 1000       | yr          | Years to smooth fire freque   |   |
| 23 |                       | Cbackground sensitivity | 1          | index       | Do you want to evaluate the   |   |
| 24 |                       | saveFigures             | 1          | index       | Do you want to save the plo   |   |
| 25 |                       | saveData                | 1          | index       | Do you want to save the out   |   |
| 26 |                       | allFigures              | 1          | index       | Do you want to display all (  |   |

All of this is done after the peak analysis – it's just different ways to plot the resulting peaks. All graphs and analyses could be repeated, modified, etc., using the resulting output data.

CO\_charResults.csv

# 3. Best practices and pitfalls

**Assess if record meets desired criteria for peak detection:**

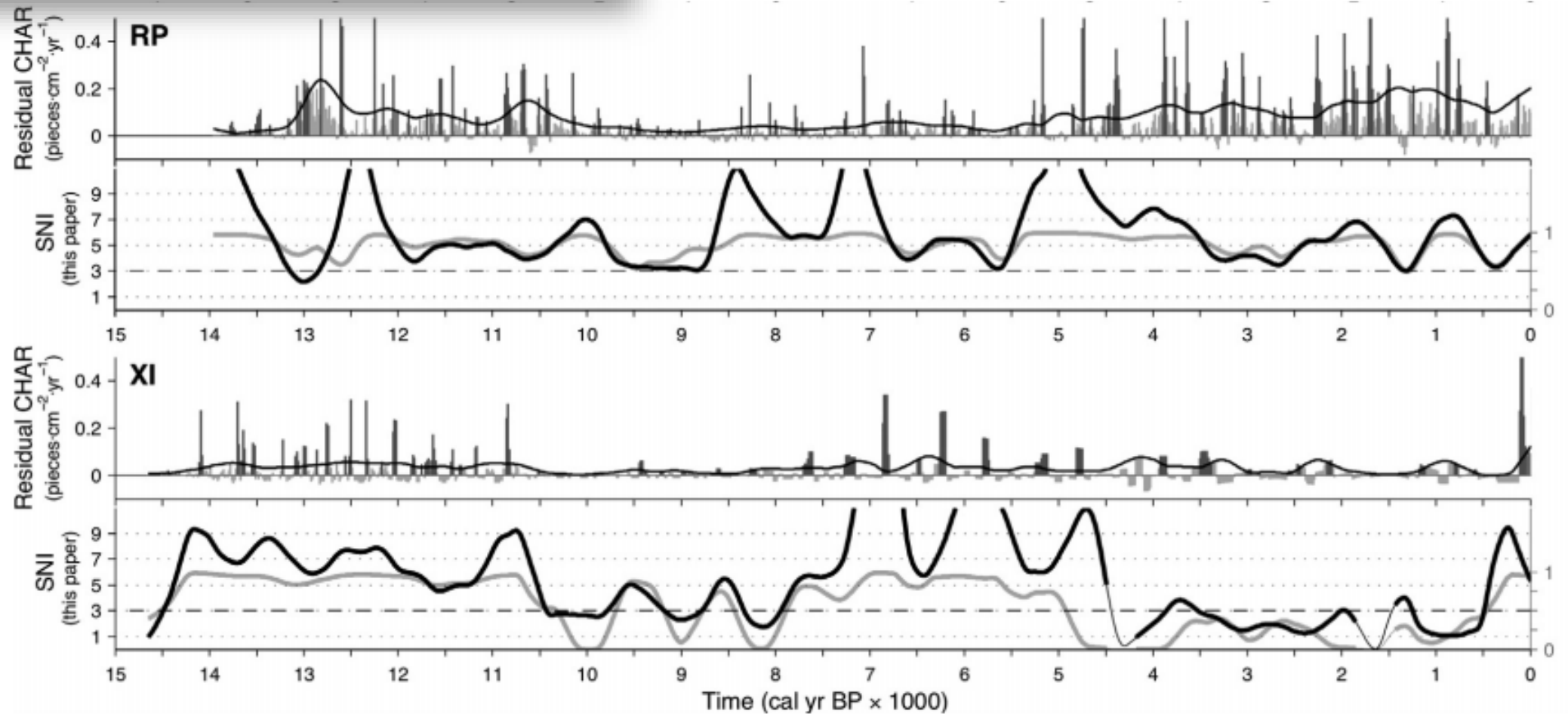
- Lake characteristics: inlet/outlet, size, topography....
- Sample resolution: years/sample, including impacts of mixing
- Expected fire regime: fire size, frequency, charcoal production
- *Signal-to-noise index > 3 for majority of records where peak analysis is done*

Short Paper

A signal-to-noise index to quantify the potential for peak detection in sediment–charcoal records

Ryan F. Kelly <sup>a,\*</sup>, Philip E. Higuera <sup>b</sup>, Carolyn M. Barrett <sup>c</sup>, Feng Sheng Hu <sup>a,c</sup>

**This signal-to-noise index (SNI) was explicitly designed to help answer the question “is this record appropriate for peak analysis?”**

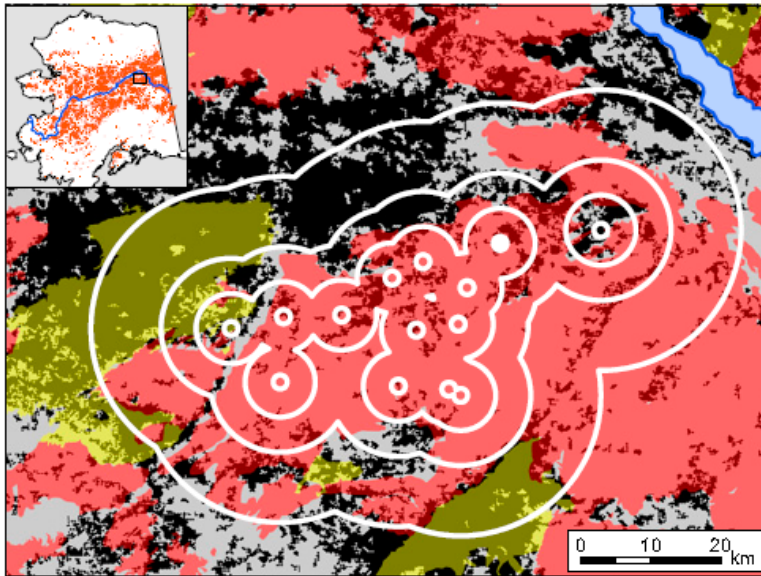




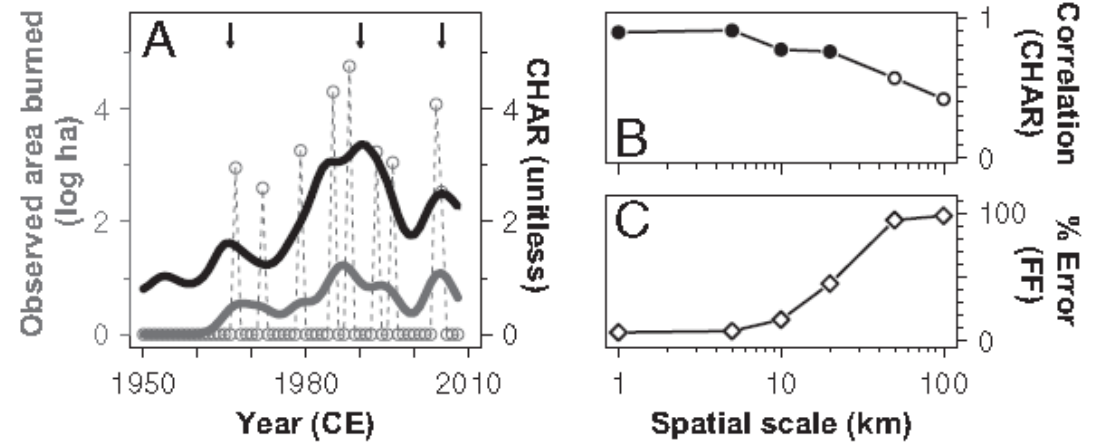
**Pitfall:** Inferring charcoal source area from limited fire history.  
e.g., if no fires occurred within X km, then it's impossible to have highest correspondence at those distances.

**Solution:** Reference studies with a complete sampling, or multiple studies, to obtain a range for charcoal source area.

*\*Remember, peaks and background have different source areas\**

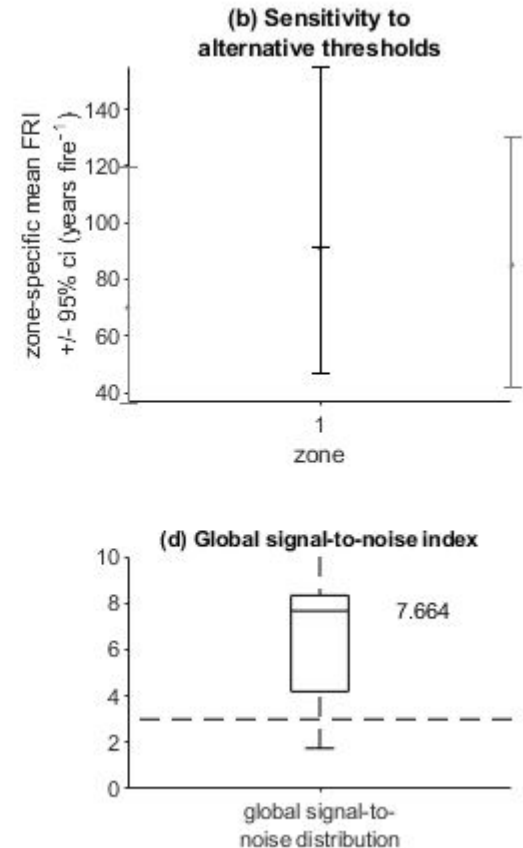
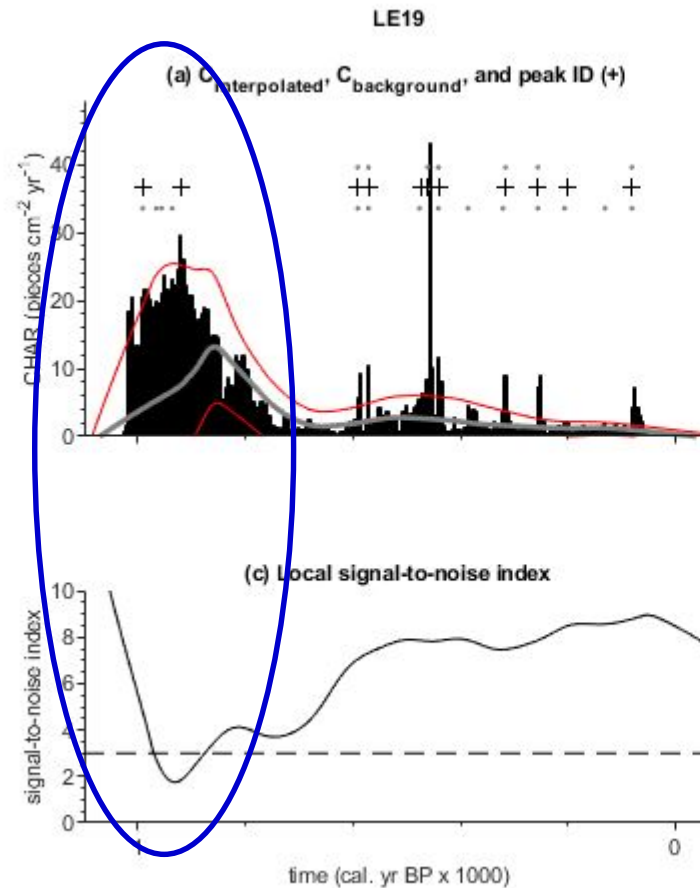


Kelly et al. 2013



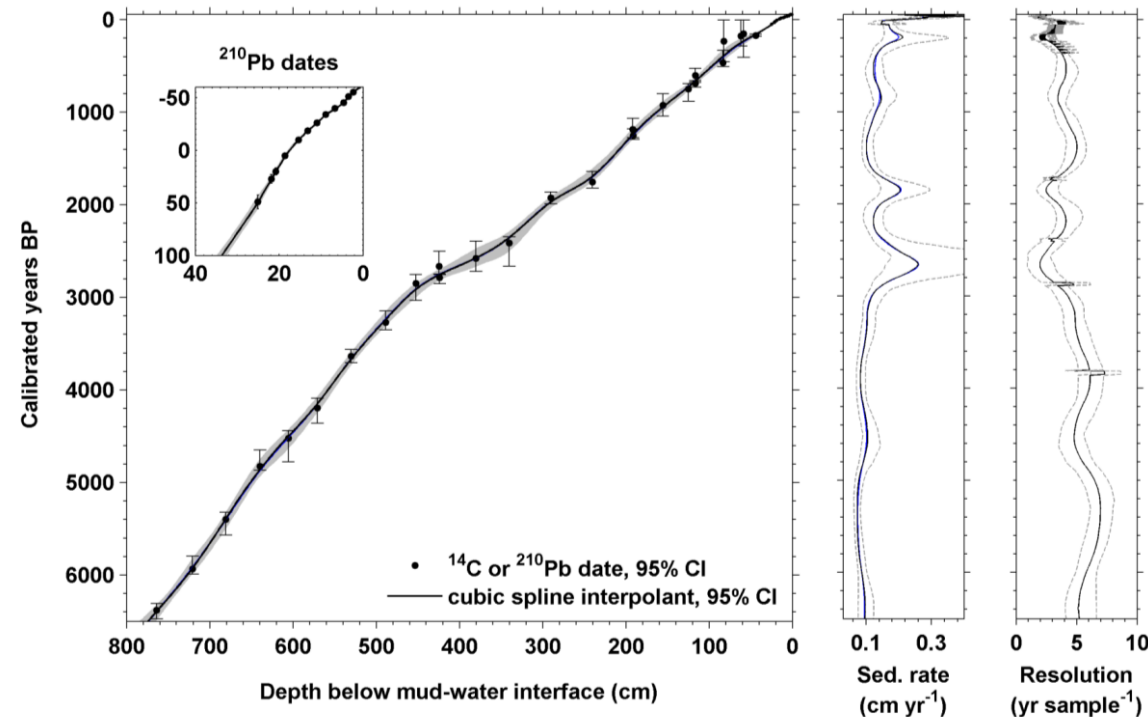
**Pitfall:** Interpreting all peaks are fires, just because the program identified a peak. Not all peaks are fires – we don't know (!)

**Solution:** Use stratigraphy and dating to assess if “double peaks” or many peaks in section of a core may represent rapid sediment accumulation; and use the SNI.



**Pitfall:** Interpreting changes in fire frequency within or between records, which may ultimately reflect varying sample resolution.

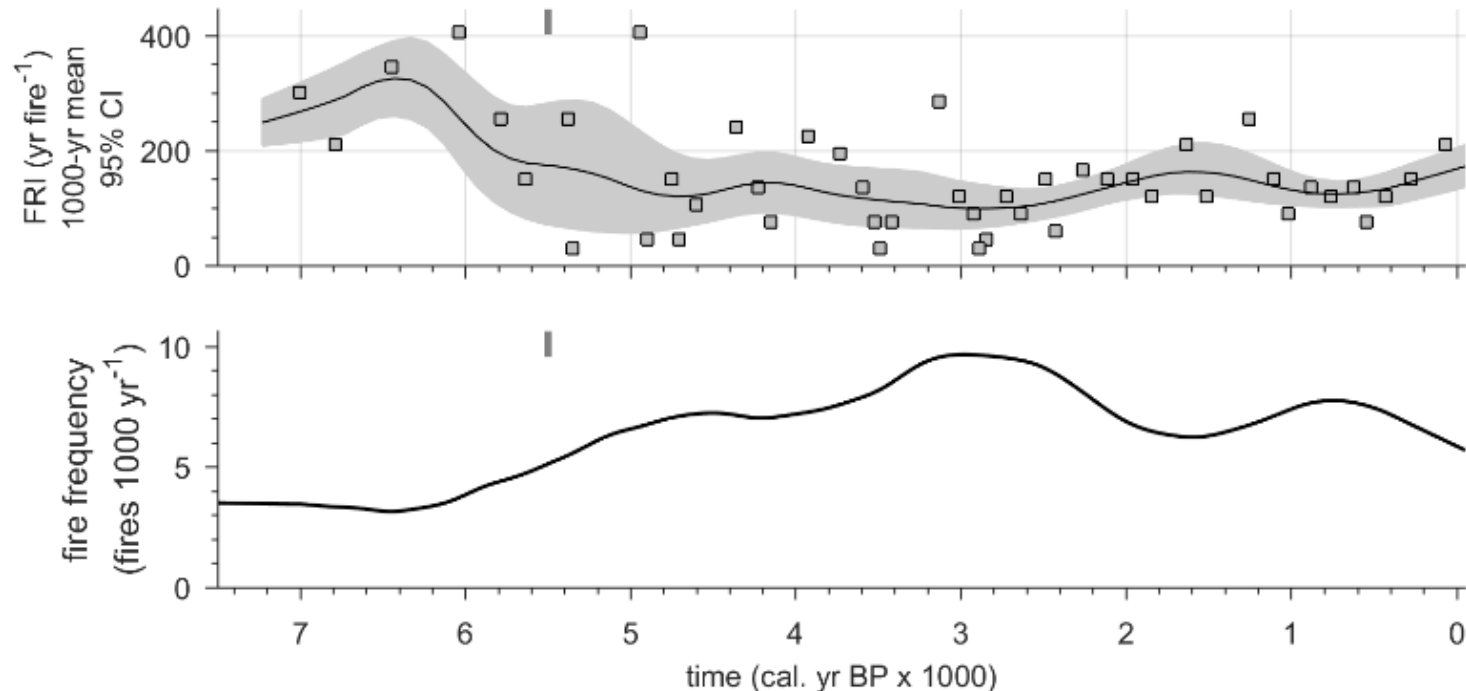
**Solution:** Interpolate samples to a common time interval helps, */F* justified by overall range of sample resolution; interpret section(s) or records with lower resolution separately.





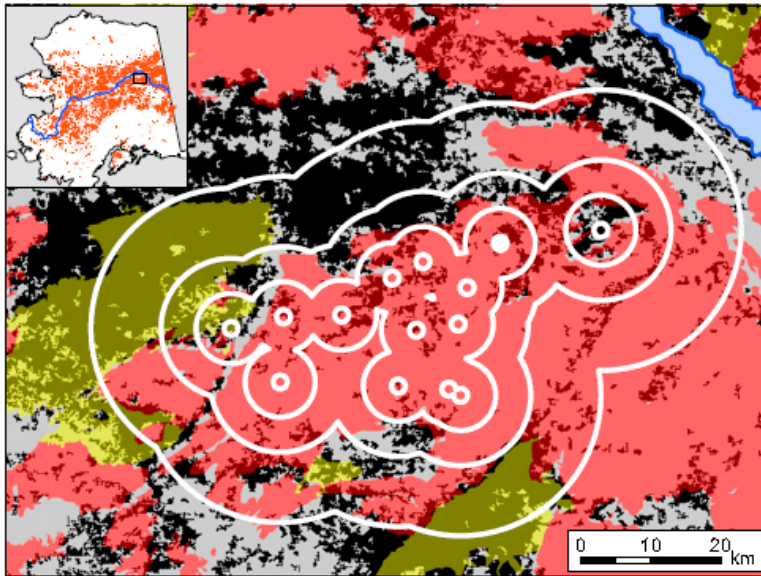
**Pitfall:** Overinterpret variability in peak frequency as changes in fires regimes, forgetting that fire occurrence is highly stochastic, even in the absence of changing fire regimes.

**Solution:** Use confidence or prediction intervals on fire frequency or fire-return intervals to assess statistically significant changes in fire occurrence; pool data from multiple sites to increase statistical power in detecting potentially changing fire activity.

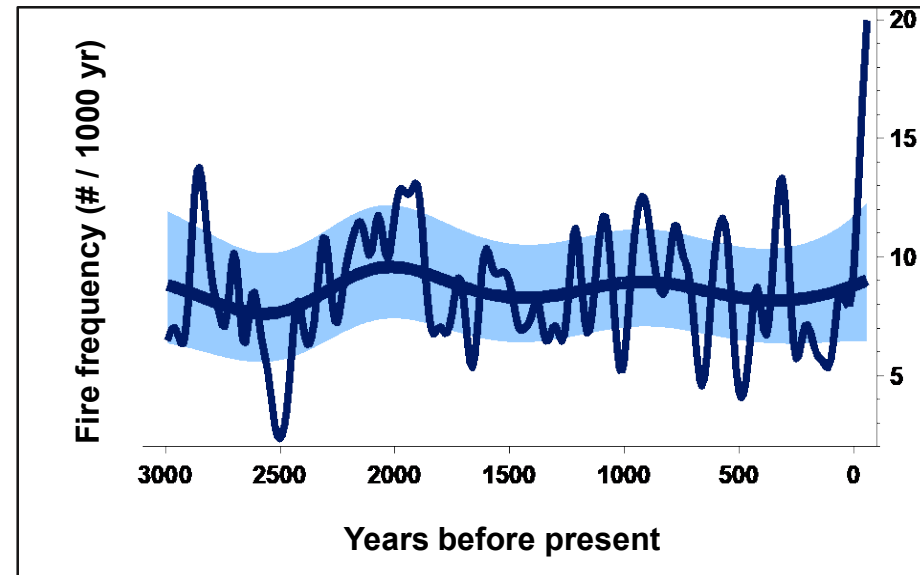


**Pitfall:** Overinterpret variability in peak frequency as changes in fires regimes, forgetting that fire occurrence is highly stochastic, even in the absence of changing fire regimes.

**Solution:** Use confidence or prediction intervals on fire frequency or fire-return intervals to assess statistically significant changes in fire occurrence; **pool data from multiple sites to increase statistical power in detecting potentially changing fire activity.**



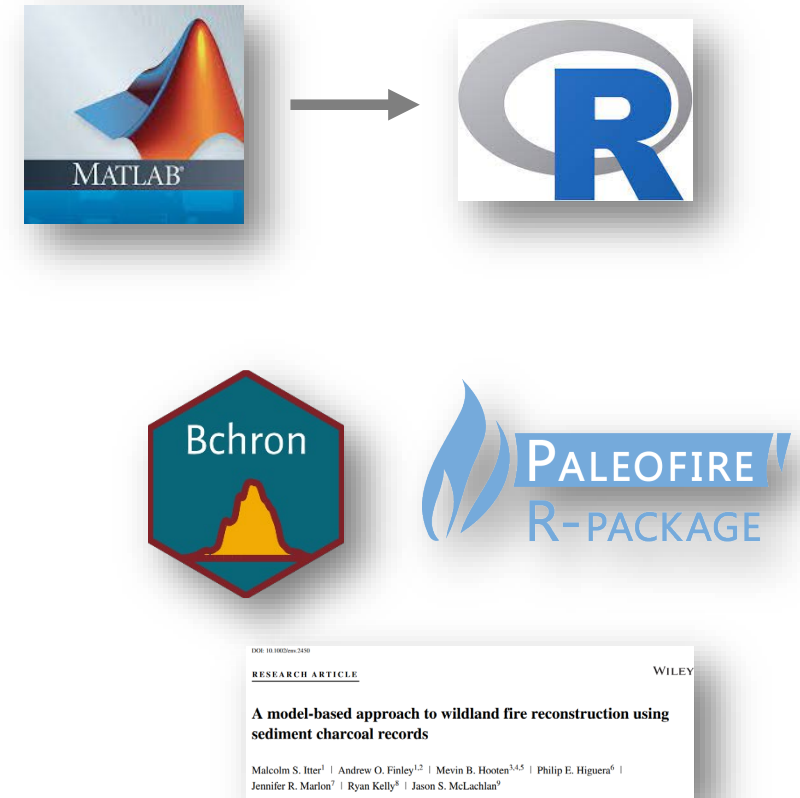
Kelly et al. 2013



# 4. The future of peak detection

## Technical needs:

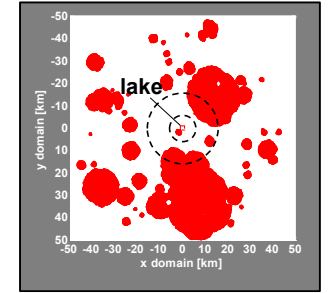
- **Facilitate development and use** and by translating *CharAnalysis* from Matlab to R
- **Develop ways to propagate uncertainties**, in dating, peak detection, and sensitivity of parameter choices, e.g., by integrating existing tools and developing new approaches (e.g., Bayesian analyses, as in Itter et al. 2017)
- **Develop with backward compatibility and compatibility with databases in mind** (e.g., IPN, Neotoma, etc.)



# 4. The future of peak detection

## Conceptual or empirical needs:

- Better understand **source area** reflected by peak, background, etc., under varying conditions, *and* implications for inference

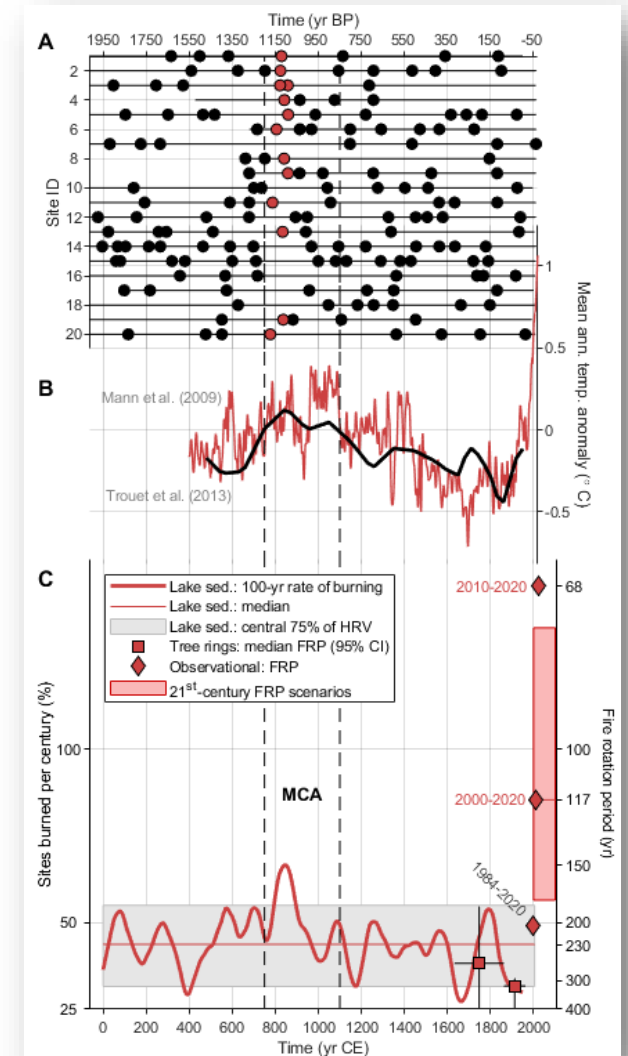




# 4. The future of peak detection

## Conceptual or empirical needs:

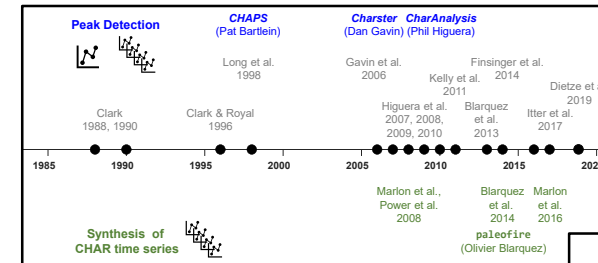
- Better understand **source area** reflected by peak, background, etc., under varying conditions, *and* implications for inference
- Improve ability to **link paleo-inferred and contemporary measures of fire activity and fire regimes**
- **Much more:** inferring fire severity, synchrony across regions, and lots of work beyond peak detection



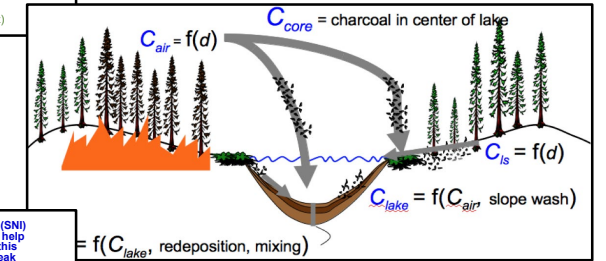
Higuera, Shuman, and Wolf. "Rocky Mountain subalpine forests now burning more than any time in recent millennia." *PNAS*. Accepted (4/2021)

# The past and future of peak detection

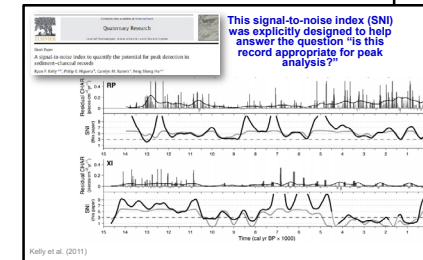
## 1. Origin and development



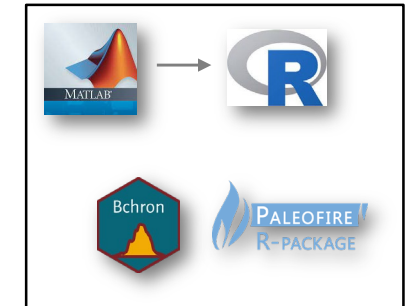
## 2. Principles of the decomposition approach



## 3. Best practices and potential pitfalls



## 4. Future needs and opportunities



Philip Higuera

Professor of Fire Ecology

@PhilipHiguera

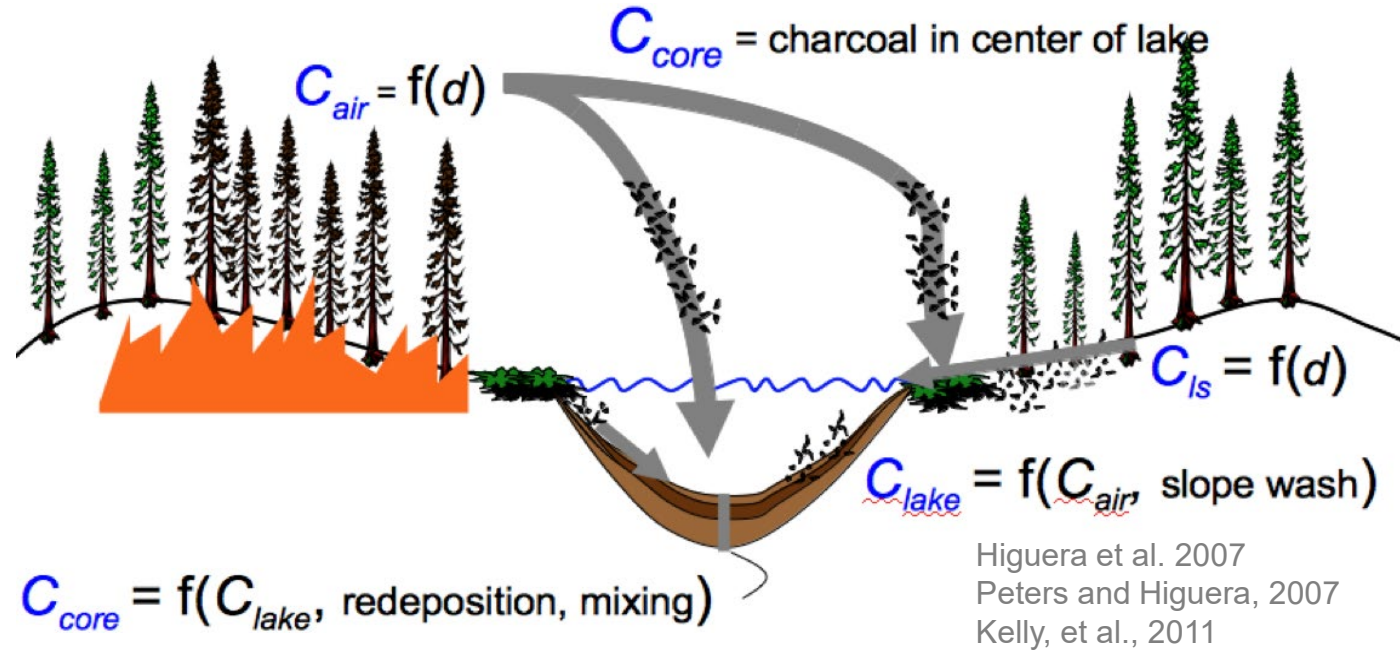
<https://github.com/phiguera/CharAnalysis>



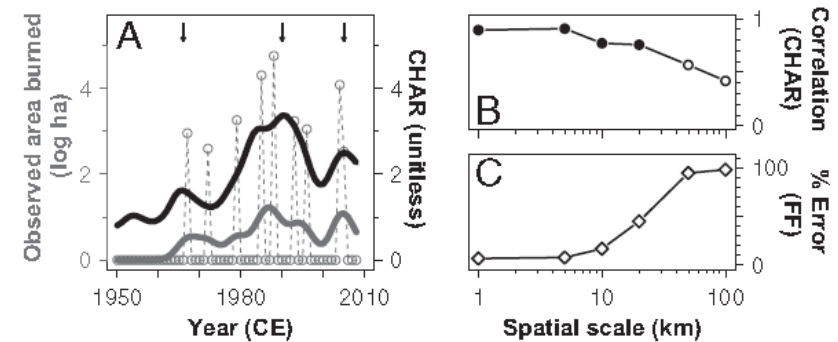
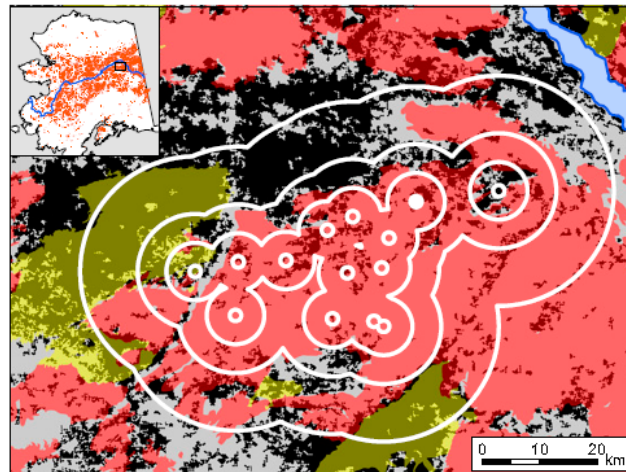
# Your questions

- 1) How does one calculate charcoal accumulation rates from unconsolidated sediments where it's difficult to get bulk density estimates, **e.g. in Archeology?**
  - 2) How does one **incorporate age dating and age-depth model uncertainties into the peak identification process?**
  - 3) How does one **estimate the general reproducibility of charcoal records concerning variations within and between lakes and in counting** (best-practice advice?)?
  - 4) **What does the background in the peak analysis represent and how could be interpreted in terms of fire history, fire factors, fire ecology or fire practice?**
  - 5) How does one **deal with the background in multi-series comparisons (would we expect more regional heterogeneity compared to peak-derived trends)?**
  - 6) **How to analyze charcoal records from lake sediments in regions where we expect very frequent fire. Is peak detection always appropriate?**
- 1) May not be able to. Conceptually, account for varying time integrated into any sample of charcoal, and consider a null model for expectations.
  - 2) See Calder et al. (2015, PNAS) for a good example. Qualitatively, interpret timing of peaks in context of age uncertainty – i.e., don't over interpret precision.
  - 3) Increase sample size, and interpret based on sample size. Use multiple records to infer regional trends in fire activity, or only interpret changes over millennial time scales in an individual record. Even with perfect accuracy, peaks are highly stochastic.
  - 4) Background reflects total charcoal production in a region; theoretically (Higuera et al. 2007) and empirically (Higuera et al. 2011, Kelly et al. 2013) it reflects total area burned. It could also reflect changes in taphonomy, so be careful....
  - 5) We would expect more consistency among background trends (IF they reflect fire activity, vs. taphonomy), because it integrates more space and time. The *Paleofire* R package implements methods to composite background trends.
  - 6) No, peak detection is not always appropriate. High-frequency, low-severity fire regimes typically result in low SNI.

## Theoretical modeling:



## Empirical calibrations:



Kelly et al. 2013  
 (Higuera et al. 2005, 2011)



**The “relevant charcoal source area” depends on dispersal distance of charcoal, *relative to* fire size.**  
***Peak and total charcoal represent two different sources areas***

