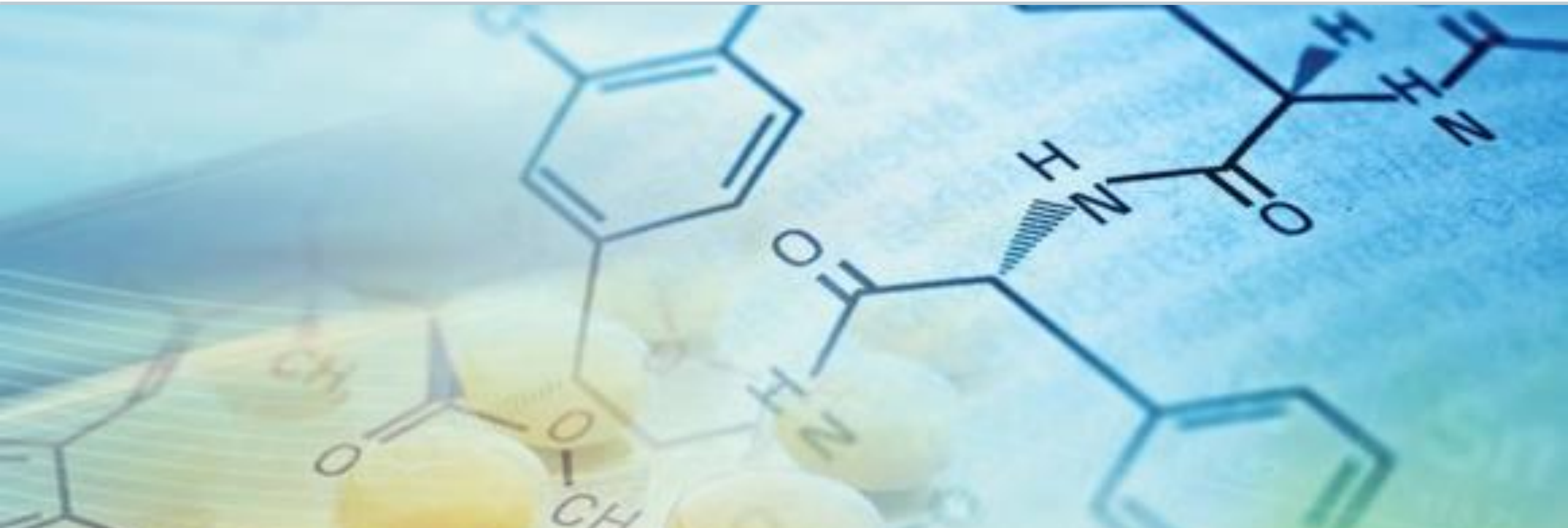


# Deep Learning Based Phase and Baseline Correction



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Bruker Biospin

P-1193, ENC 2021



# Machine Learning in NMR Spectroscopy



- The NMR community is increasingly using machine learning for the analysis of NMR spectra

## Review and Prospect: Deep Learning in Nuclear Magnetic Resonance Spectroscopy

Dicheng Chen<sup>#[a]</sup>, Zi Wang<sup>#[a]</sup>, Di Guo<sup>[b]</sup>, Vladislav Orekhov<sup>[c]</sup>, Xiaobo Qu<sup>\*[a]</sup>

## Reconstruction of spectra from truncated free induction decays by deep learning in proton magnetic resonance spectroscopy

Hyochul Lee, Hyeong Hun Lee, Hyeonjin Kim ✉

## Accelerated Nuclear Magnetic Resonance Spectroscopy with Deep Learning

Xiaobo Qu<sup>1\*</sup>, Yihui Huang<sup>1</sup>, Hengfa Lu<sup>1</sup>, Tianyu Qiu<sup>1</sup>, Di Guo<sup>2</sup>, Tatiana Agback<sup>3</sup>, Vladislav Orekhov<sup>4</sup>, Zhong Chen<sup>1\*</sup>

## NMRNet: a deep learning approach to automated peak picking of protein NMR spectra.

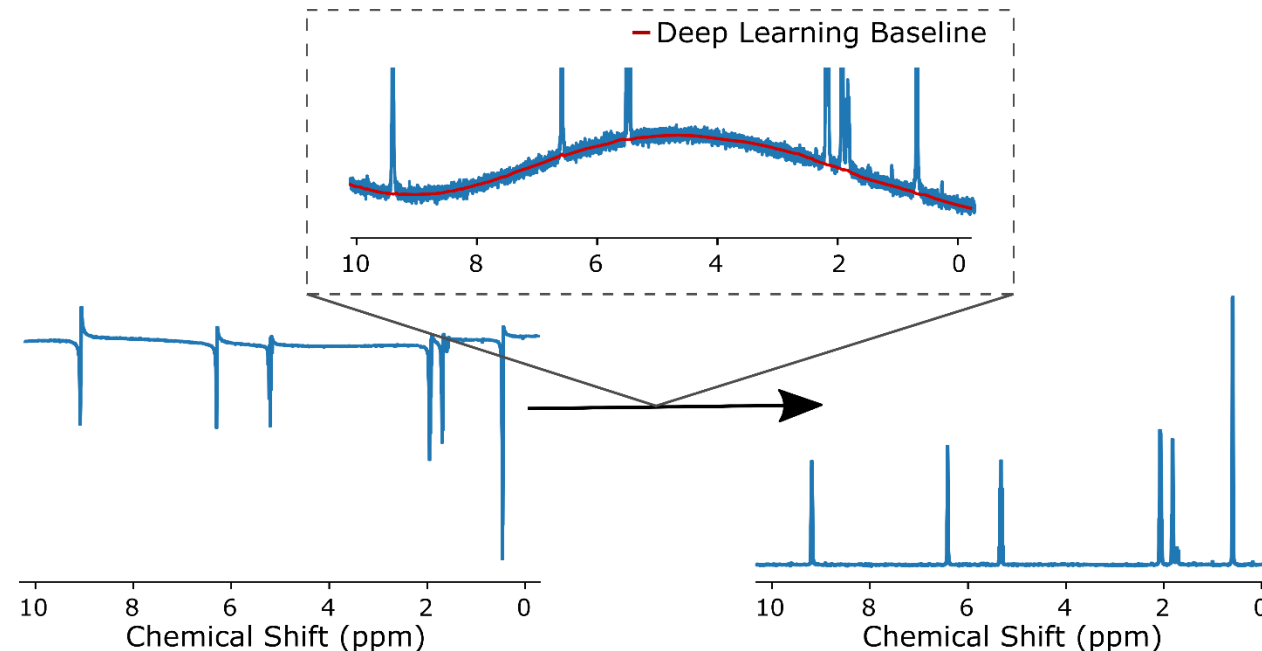
Klukowski P<sup>1</sup>, Augoff M<sup>1</sup>, Zieba M<sup>1</sup>, Drwal M<sup>1</sup>, Gonczarek A<sup>2,3</sup>, Walczak MJ<sup>4,3</sup>.

- Bruker is part of it
  - Our latest application of deep learning has resulted in an improved phase and baseline correction algorithm for unsuppressed 1D <sup>1</sup>H NMR spectra

# New *apbk* command for $^1\text{H}$ spectra



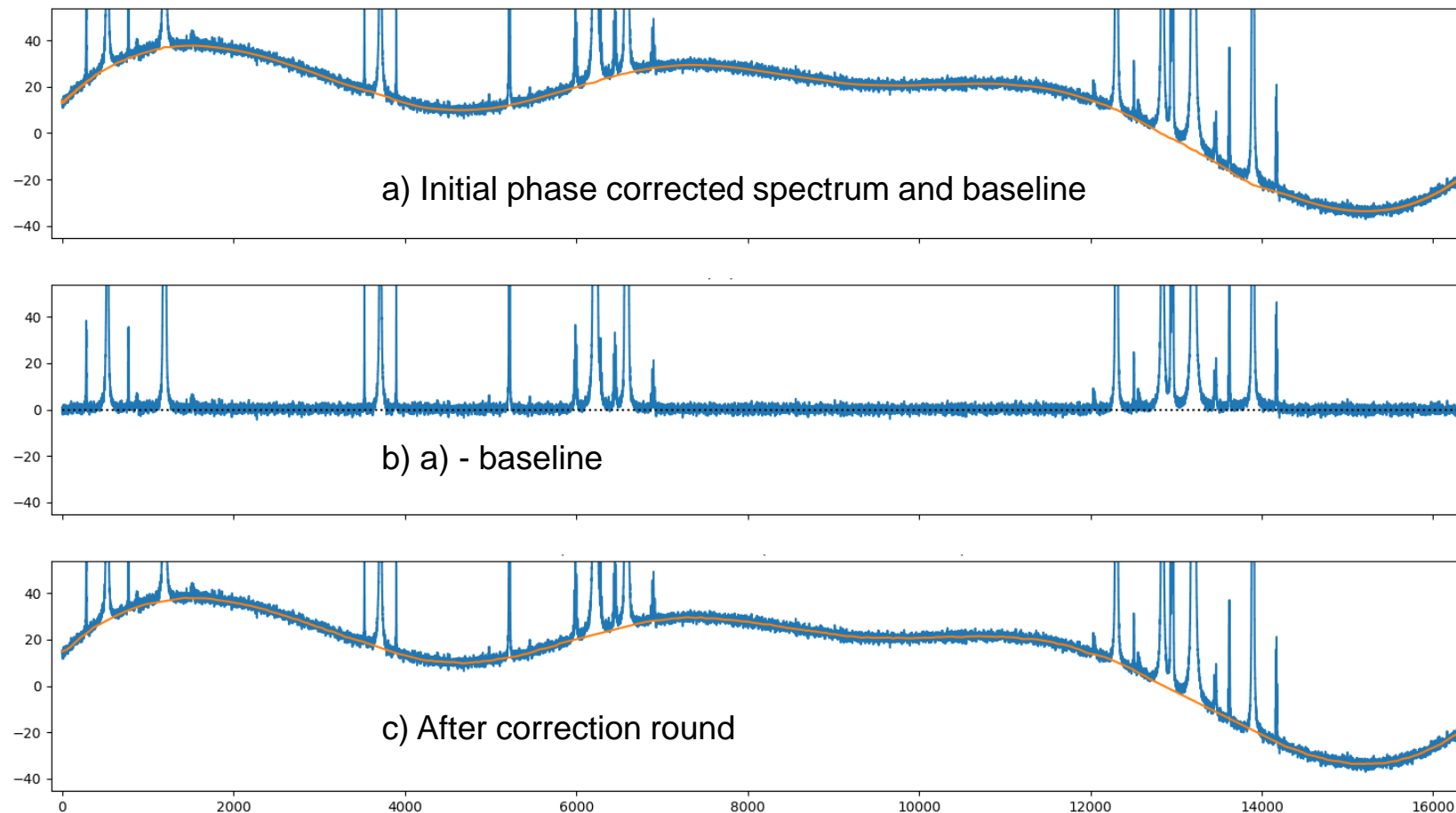
- We have developed a command for simultaneous phase and baseline correction of unsuppressed 1D  $^1\text{H}$  spectra
- The command is based on a deep learning algorithm for baseline detection



# Methods



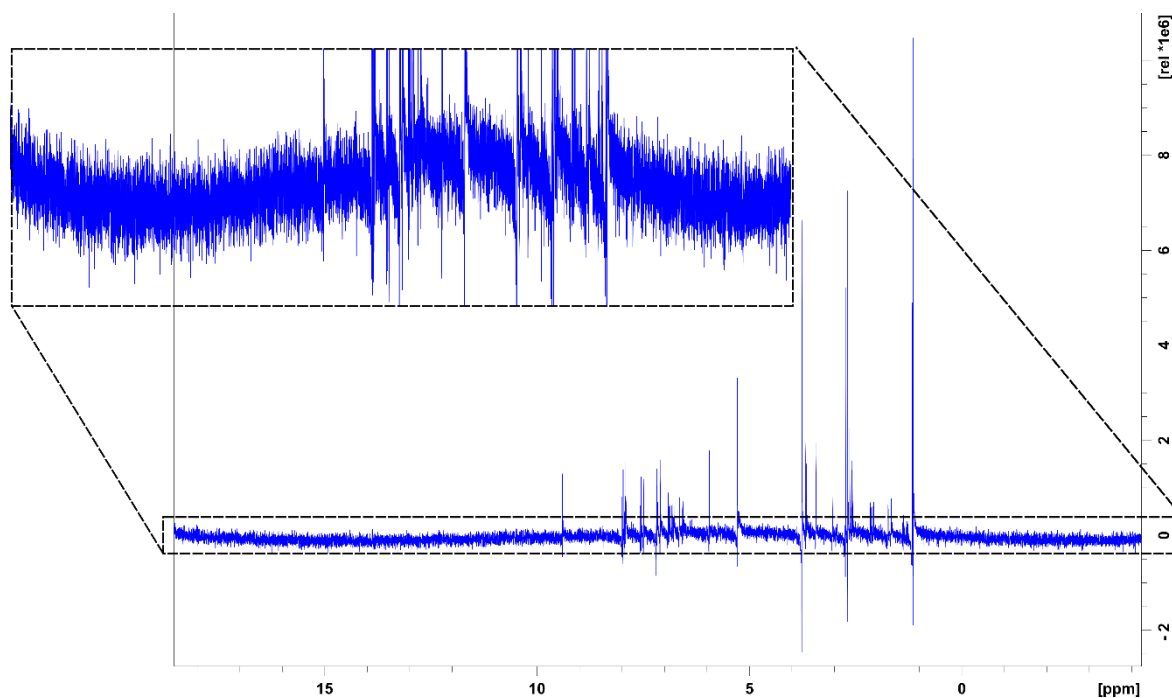
- Rough initial phase correction
- Neural network detects baseline
  - Convolutional recurrent network
  - Trained on synthetic data
- Iterative improvement of phase and baseline
  - Identify baseline regions
  - Perform phase fitting



# Methods



- The neural network was trained using 100'000 artificially generated  $^1\text{H}$  NMR spectra.



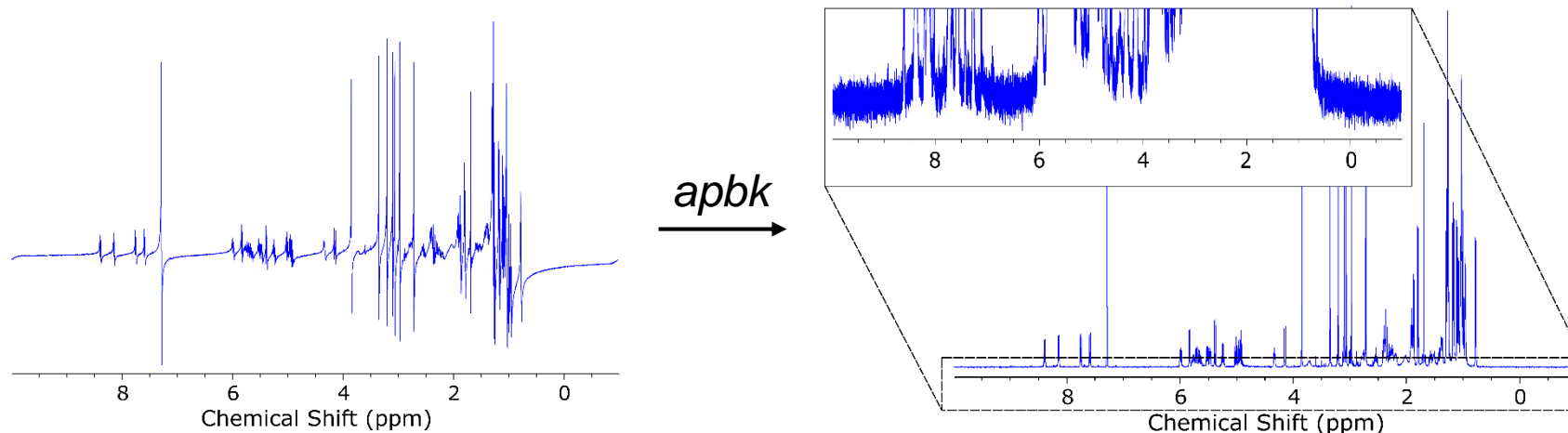
## Training set parameters:

- 80 to 800 MHz base frequencies
- 10 to 10'000 SiNo
- Distribution of line widths, multiplicities, and J couplings that match typical experimental values
- Random phase and baseline distortion

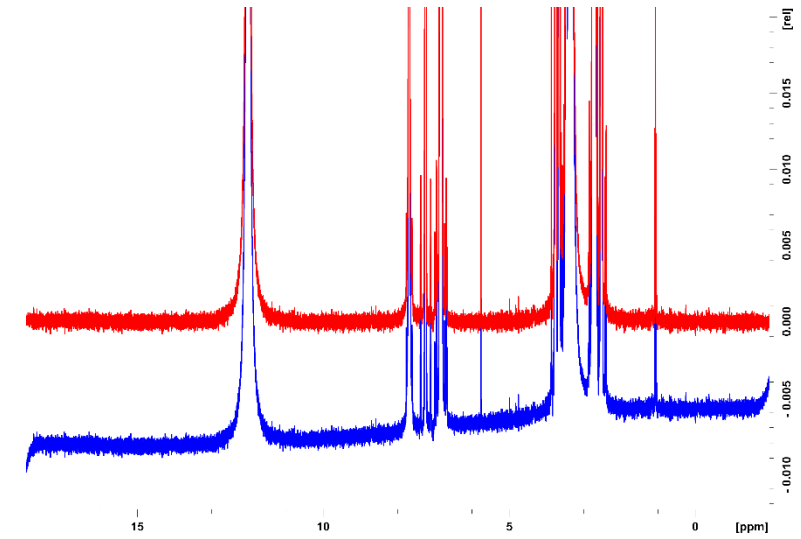
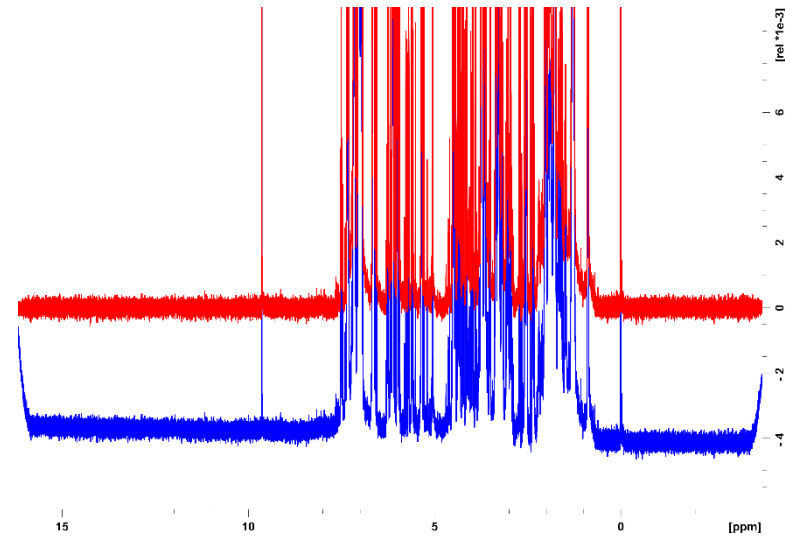
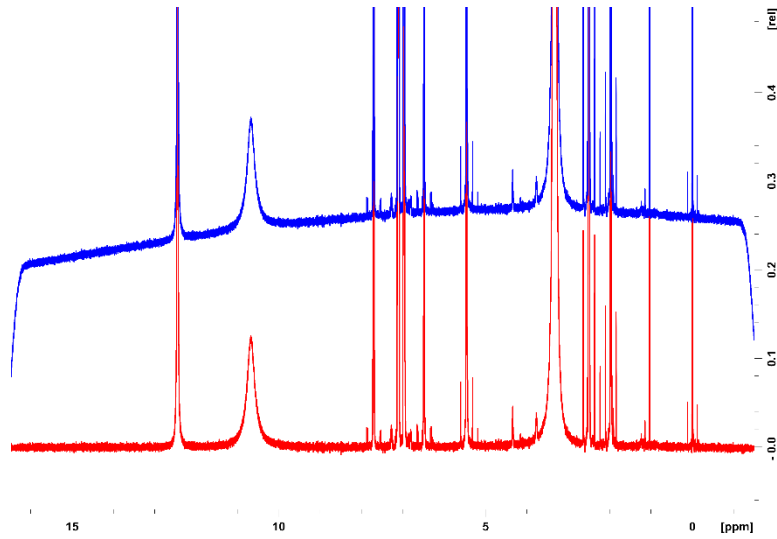
# Results



- The algorithm was tested against 100 experimental spectra that were phase and baseline corrected by NMR experts, and 1000 artificial spectra.
- It has shown overall **higher accuracy** than the commands for phase and baseline correction currently available in TopSpin (former *apbk -f* and *apk + abs*)
- It has also shown higher **robustness with respect to the base frequency**, providing excellent results also on data acquired with the Fourier 80



# Results



— Baseline only    — *apbk* result

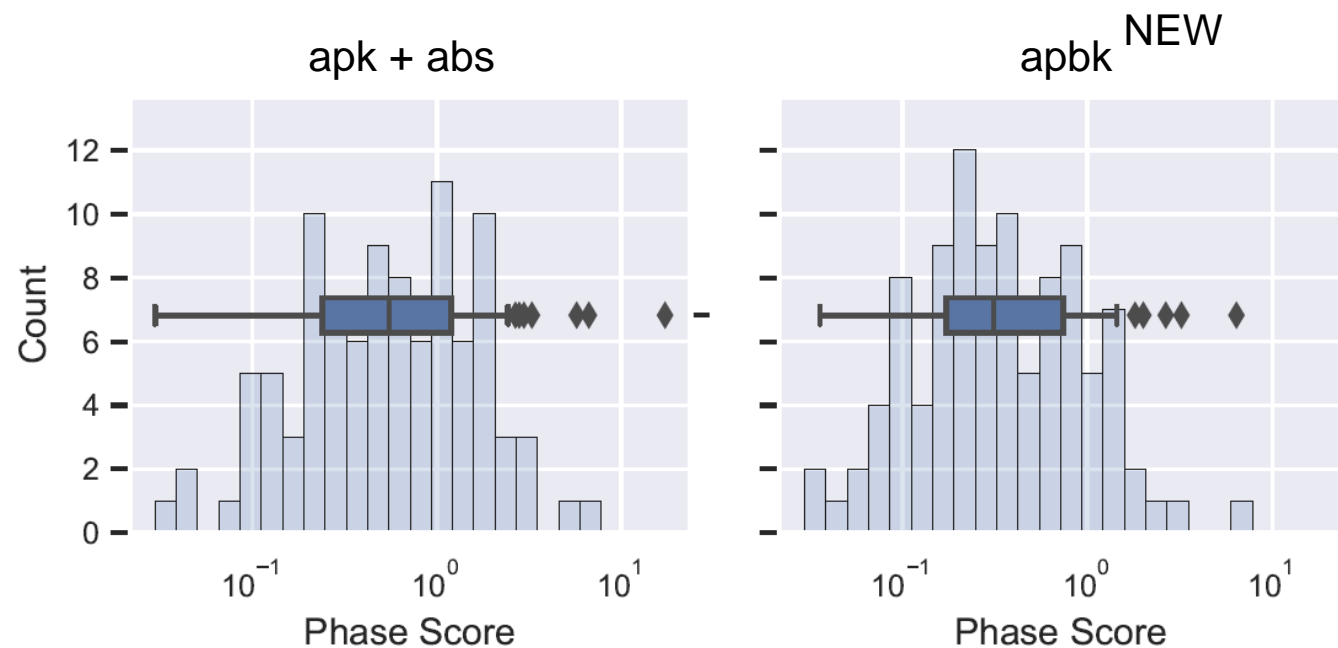
# Results



Test on 100 experimental NMR spectra (80 MHz to 800 MHz)

## Phase score

Corresponds to the average phase error of all peaks in a spectrum



Q1	0.24°	<b>0.17°</b>
Median	0.55°	<b>0.31°</b>
Q3	1.19°	<b>0.64°</b>



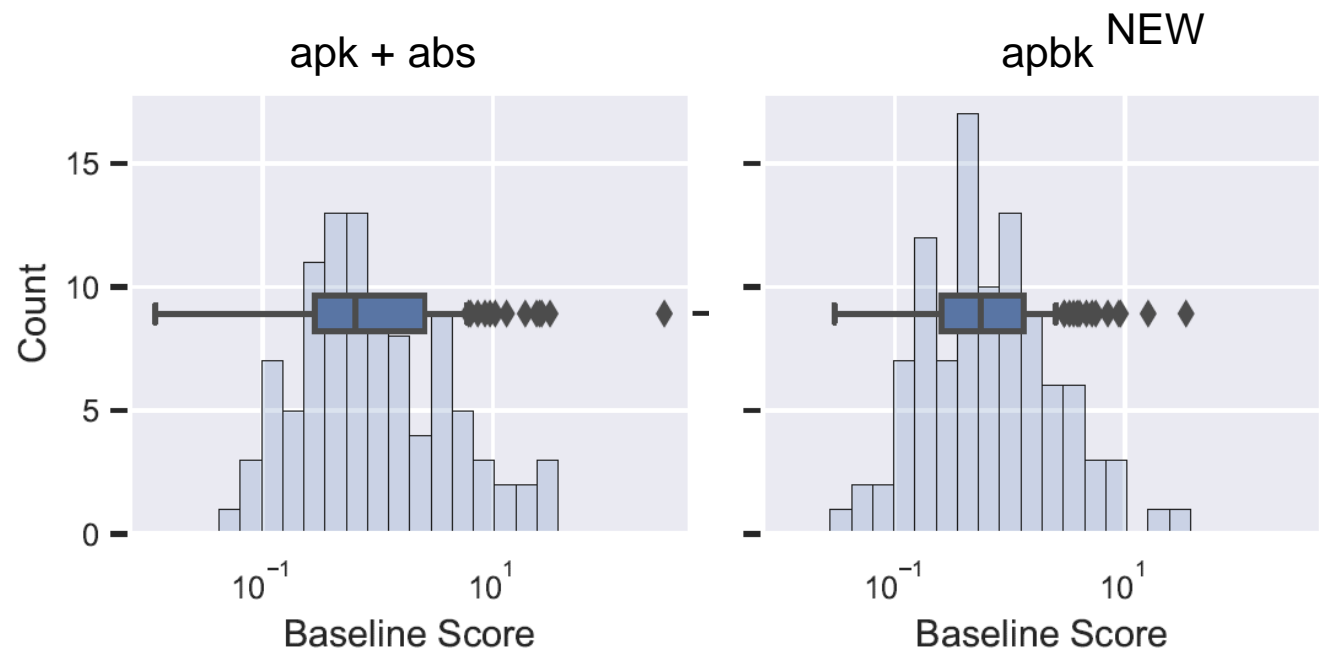
# Results



Test on 100 experimental NMR spectra (80 MHz to 800 MHz)

## Baseline score

Corresponds to the z-score of the difference between real baseline and subtracted baseline with respect to the noise



Q1	0.28	<b>0.26</b>
Median	0.64	<b>0.51</b>
Q3	2.57	<b>1.34</b>

# Release in TopSpin 4.1.2

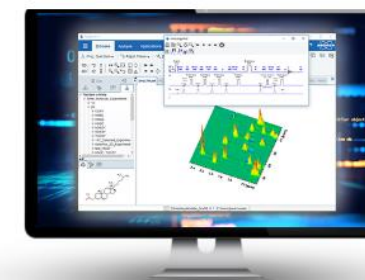
- The new *apbk* version optimized for unsuppressed  $^1\text{H}$  spectra will be available with **TopSpin 4.1.2**
- Use this algorithm by typing *apbk* in the command line with  $^1\text{H}$  1D NMR dataset open
- Additional options

*apbk -po*: performs phase correction only

*apbk -bo*: performs baseline correction only

*apbk -intrng*: uses user-defined integral regions

*apbk -apk0*: optimize only PHC0 during phase correction



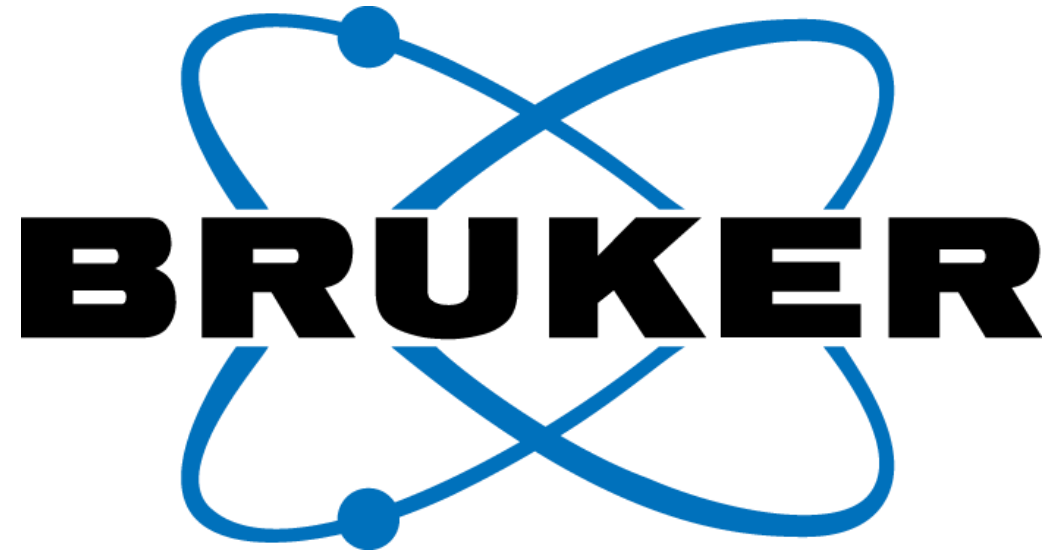
MAY 11, 2021

## Deep Learning Based Phase and Baseline Correction on NMR Spectra

Bruker's commitment in developing artificial intelligence based NMR applications has led to a new function available in TopSpin: the automatic simultaneous phase and baseline correction of  $^1\text{H}$  NMR spectra.

Curious to learn more about it ?

Stay tuned for our webinar, coming on 11<sup>th</sup> May 4pm CET



Innovation with Integrity

