# Vapor correction of FTIR spectra – a simple automatic least squares approach

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# Abstract

FTIR spectroscopy is one of the best techniques to study intermolecular interactions. However, such an application requires high quality spectra with as little noise as possible, which are often difficult to obtain. One of the main sources of unwanted interference is water vapor. Here a robust method is proposed for automatic, fast and reliable vapor correction of FTIR spectra. The presented least squares approach of vapor subtraction using many vapor spectra and a special residual function provides a much better correction. It does not rely on the researcher's experience, no coefficients are arbitrarily chosen or tweaked, thus such results are more trustworthy and accurate. *Keywords:* FTIR Spectroscopy, Vapor Correction, Least Squares

# 1 1. Introduction

FTIR spectroscopy is an invaluable tool facilitating a non-invasive testing of various types of samples. It is often used in a simple way to identify samples, confirm the presence of various functional groups or the degree of

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<sup>5</sup> conversion of substrates. Such a use of this kind of spectroscopy often requires
<sup>6</sup> neither excessive measurement parameters nor a sophisticated treatment of
<sup>7</sup> spectral data and the confirmation of the presence or absence of characteristic
<sup>8</sup> absorption bands can be made even with a significant noise.

However, it is not the case when the FTIR spectroscopy is used to study 9 interactions in solutions, mainly aqueous, or changes in the secondary struc-10 ture of proteins. Such a kind of experiments requires high resolutions, a large 11 number of independent scans, and yet the changes in the shape of measured 12 spectra in a series are usually small and obscured by noise and other inter-13 fering factors. One of the main of such factors is water vapor present even in 14 a well purged spectrometers, especially when semi-open ATR accessories are 15 used. Many strategies exist to diminish its influence on spectra: purging with 16 a dry inert gas or dried air, air-evacuated vacuum spectrometers, software-17 based automatic vapor subtraction algorithms, advanced model-based al-18 gorithms [1], special methods of data acquisition [2], or a simple by hand 10 subtraction performed by a researcher. 20

In the case of protein solution spectra measurements, the amide I band 21 is inevitably affected by the water vapor bands and its complex structure 22 is prone to the vapor correction. All methods of the resolution enhance-23 ment routinely used in the protein FTIR spectroscopy (e.g. second deriva-24 tive, Fourier self-deconvolution, etc.), increase also signals originating in the 25 improperly subtracted vapor-related bands [3, 4, 5, 6]. Thus, the vapor cor-26 rection is such an important and not trivial task which has to be performed 27 in the best possible way. 28

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The water vapor spectrum is composed of many sharp peaks which are sig-

nificantly sensitive to even slight changes of temperature in the measurement 30 chamber. Even the smallest difference between temperatures corresponding 31 to the vapor spectrum and other spectra can result in the occurrence of 32 narrow differential bands, really difficult to compensate. Purging is a good 33 choice for a short series of measurements, but the moisture content and the 34 temperature can vary significantly during a long experiment. It should be 35 used routinely during such demanding studies, however, it does not provide 36 a complete vapor correction on its own. The use of vacuum is expensive and 37 may be difficult with liquid samples. Software algorithms use a database of 38 vapor spectra which can be, and usually are inadequate to the conditions 39 prevailing in the laboratory and may significantly affect measured spectra in 40 an uncontrollable way and introduce artifacts. The smoothing is never a way 41 to deal with interference by water vapor as some spectral information and 42 resolution can be lost. 43

A direct registration and manual subtraction of the vapor spectrum is 44 usually the best choice if the time distance between the spectral series of 45 interest and the measured vapor spectrum is short. However, if the the vapor 46 spectrum is measured after the series (i.e. at the end of experiment) it rarely 47 can be perfectly subtracted from the first measured spectrum in the series. 48 The same applies if the vapor spectrum is measured before the series - it is 49 difficult to subtract it properly from the last spectrum of interest. Another 50 problem arises if the number of measured spectra to be corrected is very 51 high. An experienced researcher can subtract the vapor spectrum from each 52 of the spectra manually with an arbitrarily chosen subtraction coefficient, 53 however, because only one vapor spectrum can be subtracted at a time, the <sup>55</sup> compensation of temperature-related changes in the vapor bands is virtually
<sup>56</sup> impossible. Such a procedure is also time consuming.

The method described in this paper originates in the last described case. However, the researcher's participation is limited and despite this it gives a surprisingly good results without any assumption of subtraction coefficients.

# <sup>60</sup> 2. Materials and methods

## 61 2.1. Method description

The presented method has two significant differences in comparison to a standard way of spectral series collection and treatment: 1) additional steps during measurements are introduced, and 2) the vapor spectra fitting to the raw spectra uses a special residual function.

Experimentally, the method differs only slightly from the standard way 66 of spectra series collection. Instead of a single water vapor spectra measure-67 ment, either at the beginning or at the end of the experiment, several spectra 68 of an empty measurement chamber (or a clean internal reflection element if 69 ATR spectra are measured) are collected between samples. The number of 70 these spectra depends on the experimental conditions (e.g. the quality of inert 71 gas used to purge the spectrometer, humidity, temperature, etc.), However, 72 usually only two to three vapor spectra have a considerable contribution to 73 the overall spectral series. 74

The computational algorithm is fairly simple and employs the least squares curve fitting procedure. In contrast to the band fitting procedure, routinely used in FTIR spectroscopy, the residual function used for minimization is not a simple difference between original spectrum and a sum of vapor spec<sup>79</sup> tra multiplied by appropriate coefficients. It should be a difference between <sup>80</sup> original spectrum  $(Y_{\nu})$  and a sum of *n* vapor spectra  $(V_{\nu,n}$  with appropriate <sup>81</sup> subtraction coefficients  $a_n$ ) and an ideal vapor-corrected spectrum  $\bar{Y}_{\nu}$ :

$$r_{\nu} = Y_{\nu} - \left(\sum_{n} a_n V_{n,\nu} + \bar{Y}_{\nu}\right) \tag{1}$$

<sup>82</sup> The equation can be represented in an equivalent form:

$$r_{\nu} = \left(Y_{\nu} - \sum_{n} a_n V_{\nu,n}\right) - \bar{Y}_{\nu} \tag{2}$$

where  $(Y_{\nu} - \sum_{n} a_{n} V_{\nu,n})$  is the original spectrum from which n vapor spectra 83 were subtracted, and  $Y_{\nu}$  is the spectrum perfectly devoid of the vapor con-84 tribution. However,  $\bar{Y}_{\nu}$  is not available before subtraction and its shape has 85 to be estimated. In each optimization step the vapor-corrected spectrum is 86 approximated by smoothing of the difference between the original spectrum 87 and the sum of vapor spectra multiplied by initial or optimized coefficients, 88 i.e.  $(Y_{\nu} - \sum_{n} a_{n} V_{\nu n})$ . If these subtraction coefficients are close to the ideal 89 ones, or become so during the optimization procedure, vapor spectra are sub-90 tracted almost perfectly and the smoothing procedure diminishes only the 91 experimental error. This way, the smoothed spectrum becomes as close to the 92 ideal vapor-corrected spectrum as possible, and  $r_{\nu}$  can be minimized. The 93 least squares minimization procedure with such a residual function results 94 with a set of optimized vapor spectra subtraction coefficients. Finally, these 95 coefficients can be used to remove the vapor contribution from the original 96 spectrum. All these steps are additionally presented in Figure 1. 97

## 98 2.2. General remarks

<sup>99</sup> In the Python script<sup>1</sup> available on the web page of the article the Savitzky– <sup>100</sup> Golay smoothing algorithm is applied [7], however, any other efficient smooth-<sup>101</sup> ing procedures can be employed to this purpose. Additionally, a quadratic <sup>102</sup> baseline is implemented in the script during the optimization procedure to <sup>103</sup> compensate any baseline drifts in measured spectra. However, only vapor <sup>104</sup> components are finally subtracted from the raw spectra, not the fitted base-<sup>105</sup> line.

It seems that the presented method is not very sensitive to the choice of the smoothing parameters<sup>2</sup> making it easier to apply by an inexperienced researcher. It must be stressed, however, that the smoothing step is employed only for estimation of the ideal spectrum shape and is not used to artificially improve the shape of original spectrum or the resultant vapor-corrected spectrum.

The method gives also the best results if applied to a selected part of the FTIR spectrum where the vapor noise affects the analyzed bands, and not to the full range mid-FTIR spectrum. Thus, in the following example the region of 1950–1350  $cm^{-1}$  was selected.

<sup>&</sup>lt;sup>1</sup>vaporfit.py and sample data files can be found online at Supplementary Material web page of the article.

<sup>&</sup>lt;sup>2</sup>During the development of the method, I tried various combinations of polynomial degrees and number of points used in the Savitzky–Golay smoothing algorithm. The results were equally good if the polynomial degrees were higher than 2 and the number of points was less than 50. The improper subtraction was apparent if those parameters were very high or very low. However, the useful range of those parameters was still very broad and the choice did not affect the quality of results.

## <sup>116</sup> 2.3. Experimental setup of the example application

An example series of 36 aqueous solutions of N-methylacetamide (NMA, 117 0.00 to 1.01  $mol \cdot dm^{-3}$ ) were measured by means of the Nicolet 8700 FTIR 118 spectrometer (Thermo) equipped with a single reflection GoldenGate ATR 119 accessory (Specac). The accessory had a diamond single internal reflection 120 element opened to the outside of the FTIR spectrometer. The interior of the 121 accessory was also purged with dry nitrogen. Such a setup allowed to change 122 samples without the need to open the measuring chamber and minimized a 123 possible interruption in the flow of dry gas. The resolution of all spectra was 124 set to 2  $cm^{-1}$  and the number of independent scans was set to 256. The 125 spectrometer was purged with dry nitrogen two hours before and during the 126 experiment. One background spectrum was measured prior to the series. 127 During the measurement, nine additional vapor spectra were collected after 128 each four spectra of the series. 129

The series of spectra of aqueous solutions of NMA is a part of a larger 130 experimental setup which will provide information on interactions of this 131 small peptide-mimicking molecule with other co-solutes. The scope of the 132 article is, however, focused on the method of vapor spectra subtraction, thus 133 the meaning of changes visible in these spectra is not given in this paper. 134 This particular experiment will serve to determine changes caused in the 135 shape of the amide I band caused only by the change in NMA concentration. 136 In this case, the band shape is composed of two main contributions: carbonyl 137 and amide bands of NMA, and OH bending bands of water. Other examples 138 of vapor correction are available in Supplementary Material. 130

#### <sup>140</sup> 3. Results and discussion

Results of the correction of NMA spectral series with nine vapor spectra are presented in Supplementary Material file Figure (the number of visible spectra shown in this figure has been reduced for better clarity). The selected wavenumber range corresponds to the amide I band of the NMA and bending vibrations of water molecules. Other examples are also available in Supplementary Material with two additional data files to test the vaporfit.py script.

A selected single raw spectrum has been overlaid with the result of vapor-148 correction in Figure 2a. As can be seen in Figure 2b, two first vapor spectra 149 have the highest impact on the correction as their subtraction coefficients are 150 significantly different from 0. However, their signs are opposite, suggesting 151 that none of the corresponding spectra could perfectly compensate vapor 152 bands visible in Figure 2a on its own and the correction is improved by 153 interchanging of these two vapor spectra. In this case, these subtraction 154 coefficients indicate that the vapor contribution is in-between first and second 155 vapor spectrum and a subtraction of single selected vapor spectrum could 156 be insufficient. The most probable reason for such a set of coefficients is 157 that the vapor properties, expressed also in the measured sample spectra, 158 varied mostly between first and second measurements of vapor spectra. The 159 properties and spectral shape of other vapor spectra was apparently fairly 160 constant. However, the fitting procedure involving numerous parameters can 161 result in a completely different set of coefficients yet the most important goal 162 of the method is the most accurate vapor subtraction, not the determination 163 of subtraction coefficients itself. 164

Yet the method can also be used if only one vapor spectrum is available. 165 In such a situation, it just finds the optimal subtraction coefficient of the 166 spectrum from the spectra of interest. The time consuming step of by hand 167 vapor correction is omitted and the whole spectra analysis can be signifi-168 cantly sped up. An example of such a case is presented in Figure 3. Panels 169 a) and b) show a fragment of the series of aqueous solutions of NMA spec-170 tra in the range of 1850–1750  $cm^{-1}$  with corresponding nine vapor spectra. 171 Spectra from a) were corrected in two ways: c) by using only one vapor spec-172 trum and d) with all available vapor spectra. The difference could be barely 173 recognizable on a full-range spectrum, and in most cases such a subtraction 174 would be really satisfying, yet the magnification reveals that the use of all 175 available vapor spectra results in a better correction. 176

#### 177 4. Conclusions

Because many vapor spectra, corresponding to variable environmental 178 conditions of the experiment, are subtracted simultaneously, the subtraction 170 provides a much better correction. The method uses vapor spectra mea-180 sured before, after and between samples which gives a perfect picture of 181 environmental changeability during the experiment. It does not rely on the 182 researcher's experience, no coefficients are arbitrarily chosen or tweaked more 183 or less by hand, thus such results can be more trustworthy and more accu-184 rate. The procedure is almost automatic and can save time as the vapor 185 spectra are not subtracted one by one by a researcher. Its implementation 186 in a computational environment (e.g. Python, Matlab) is easy as it involves 187 only an appropriate residual function for the least squares method including 188

the smoothing step. No calibration step is needed and there is no need for
a more sophisticated methods of data analysis (e.g. Principal Component
Analysis).

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## <sup>195</sup> 6. Declaration of interest

<sup>196</sup> Declarations of interest: none

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Measure spectra of samples and *n* additional vapor spectra in between the samples Divide all spectra into sets of samples spectra and *n* vapor spectra,  $V_{\nu}$ For each sample spectrum,  $Y_{\nu}$ : Randomly or arbitrarily select subtraction coefficients, *a*, of each vapor spectrum,  $V_{\nu}$ Fit subtraction coefficients with the least squares method to minimize the residual  $r_{\nu}$  function:  $\begin{cases} \sum_{n} a_{n} V_{\nu,n} = \text{sum of all vapor spectra multiplied} \\ \text{by subtraction coefficients} \end{cases}$  $(Y_{\nu} - \sum_{n} a_{n} V_{\nu,n}) = \text{result of subtraction of the sum} \\ \text{from the sample spectrum} \\ \overline{Y}_{\nu}: = \text{result of } (Y_{\nu} - \sum_{n} a_{n} V_{\nu,n}) \text{ smoothing} \\ \text{with a smoothing method of choice} \\ r_{\nu} = (Y_{\nu} - \sum_{n} a_{n} V_{\nu,n}) - \overline{Y}_{\nu}$ 

Multiply vapor spectra by appropriate fitted coefficients and calculate their optimized sum

Subtract the optimized sum of vapor spectra from sample spectrum

Figure 1: Chart representing main steps of the vapor spectra subtraction method. 12



Figure 2: A single spectrum (blue) overlaid with a corresponding vapor-corrected spectrum (orange), and b) subtraction coefficients of consecutive vapor spectra optimized during the subtraction procedure.



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Figure 3: a) A magnified fragment of the spectra series from Figure 1a with b) nine vapor spectra in the same spectral region. c) The result of subtraction of a single vapor spectrum from the series in comparison to d) the result of all nine vapor spectra subtraction.