



Towards a New Approach for Fast Diagnosis of Tuberculosis using Gas Chromatography-Mass Spectrometry

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1 Summary

2 Tuberculosis (TB) remains a major problem in public health worldwide. According to the World
3 Health Organization an estimated 8.6 million people developed TB and 1.3 million died from this
4 disease in 2012. Despite persistent efforts over the last 125 years to develop a simple tool for the
5 rapid diagnosis of tuberculosis, the ideal method has proven elusive. It is clear that GC–MS offers
6 considerable advantages for the analysis of complex biological samples. In this thesis we discuss two
7 main areas in which progress is sought. The first is the discovery of novel biomarkers for diagnosis of
8 tuberculosis using GC–MS and chemometrics. The second is the development of an affordable,
9 accurate and ‘simple to use’ point of care test for diagnosing tuberculosis using a small (trans)-
10 portable or hand-held device based on GC technique.

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12 *Chapter one* of this thesis describes briefly the role of analytical chemistry and chemometrics in the
13 analysis of complex samples. A brief overview of recent developments and remaining problems in
14 the diagnosis of tuberculosis is also presented. It is then explained why biomarker discovery has
15 become a strong desire in TB research. Finally it is explained how modern, highly powerful GC–MS
16 techniques can be applied for identification and quantification of specific biomarkers for TB in real
17 specimens from suspected patients.

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19 *Chapter two* of the thesis briefly summarizes the current status of tuberculosis diagnostics research
20 and future aspects in the use of GC–MS to search for novel biomarkers of MTB. Volatile biomarkers
21 for TB in the headspace of bacterial culture samples or in samples of breath, serum or urine show
22 little consistency in the various studies to date. Reproducibility is difficult; the impressive results
23 found initially with a few patients are rarely repeatable when a larger sample series is tested. Break-
24 down products derived from mycobacterial lipids show more consistency as biomarkers of
25 tuberculosis in several studies. This approach offers promise for distinguishing MTB from NTM
26 directly in sputum and does offer great potential towards a much simpler near-bedside test that
27 could be widely used in resource-constrained countries.

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29 *Chapter three* of the thesis describes a promising approach for the identification of novel biomarkers
30 to differentiate MTB and NTM in early cultures using a fully automated procedure based on
31 thermally-assisted hydrolysis and methylation followed by GC-MS (THM–GC–MS) and advanced
32 chemometrics. We used early cultures of 15 MTB and 29 NTM strains from the Netherlands grown in

33 Middlebrook 7H9 liquid medium to build a classification model for distinguishing MTB from NTM.
34 The final model performed with better than 95% accuracy in differentiation between MTB and NTM
35 in early cultures using a combination of 20 different compounds. These biomarkers have been
36 chemically identified using mass spectral interpretation. Some of these compounds have not been
37 linked to tuberculosis before, others have been proposed previously as diagnostic biomarkers for this
38 disease.

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40 *Chapter four* of the thesis demonstrates the validation of the 20-compound model developed in
41 chapter three using two independent sample sets, one consisting of 56 isolates (39 MTB and 17
42 NTM) from the Netherlands, the other comprising 103 isolates (91 MTB and 12 NTM) from
43 Stellenbosch, Cape Town, South Africa. All the MTB strains in the 56 Dutch samples were correctly
44 identified and the model had a sensitivity of 100% and a specificity of 94%. For the South African
45 samples the model had a sensitivity of 88% and specificity of 100%. The model performed less good
46 for the South African sample set compared to the Dutch samples. Based on these results, it is clear
47 that for optimum performance of the model, the training set used to derive the model should consist
48 of locally occurring strains and should contain a balanced numbers of MTB and NTM strains
49 (preferably approximately 50%). To improve the sensitivity of the model for South African strains,
50 whilst maintaining a high specificity, we have developed new decision-tree models that allow the
51 differentiation of MTB from NTM using two different algorithms. One algorithm was constructed
52 using visual inspection of the data. This algorithm enabled correct classification of all 103 samples
53 from South Africa as well as of the 100 samples from the Netherlands, i.e. it gave 100% sensitivity
54 and specificity. This decision-tree model was based on the use of a combination of eight potential
55 biomarkers from the 20-compound list. Another tree was fitted using the Classification and
56 Regression Tree (CART) method. The resulting model was extremely simple (only two compounds
57 were included), yet highly accurate (99.5% accuracy). Although promising, more samples need to be
58 classified to evaluate this algorithm.

59
60 *Chapter five* of the thesis focuses on the development of a clean-up procedure for the analysis of the
61 20 potential biomarkers for diagnosing tuberculosis directly in sputum from South Africa. The final
62 method for the analysis consisted of a hexane/methanol/water extraction followed by a further solid
63 phase extraction (SPE) clean up and finally THM–GC–MS. Based on the mycocerosate markers, the
64 detection limit of the method was approximately 1×10^4 bacteria spiked. This detection limit is
65 lower than that of microscopy and therefore sufficient for early detection of MTB directly in sputum.
66 Finally, 32 South African sputum samples from patients suspected of having tuberculosis were blindly

67 tested using the method developed. The results from our method show an excellent agreement with
68 those obtained from Ziehl-Neelsen and culturing. More samples need to be tested to further
69 evaluate the sensitivity and specificity of our combined sample preparation and analysis method. The
70 results obtained show that the new extraction-SPE-THM-GC-MS method is promising for detection
71 of MTB directly in suspected sputum samples and holds great potential for fully automating the
72 whole procedure. The work currently proceeds towards the development of a miniaturized GC-based
73 device for detection of MTB at the point of care.

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75 *Chapter six* of the thesis describes the development of a miniaturized GC-based device for detection
76 of potential biomarkers for tuberculosis in the field. The device consists of a GC inlet equipped by a
77 PTV injector that is connected to a heated micro-GC column cartridge. The device showed a good
78 performance in the separation of low boiling components; unfortunately however, severe peak
79 splitting, the so-called “Christmas tree effect”, was observed for higher boiling components such as
80 the higher alkanes or higher FAMES (e.g. C16 and C18). The peak splitting is caused by a non-uniform
81 oven temperature along the length of the column. Clearly further improvements to the device are
82 needed to allow separation of the high-boiling components on our target list of 20 marker
83 compounds.

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85 *Chapter seven* of the thesis presents an interesting application of the novel sample preparation
86 method developed in chapter five of this thesis. The hexane/methanol/water extraction procedure
87 followed by SPE-THM-GC-MS developed for the analysis of sputum samples was here applied for
88 detection of *Mycobacterium avium subspecies paratuberculosis* (MAP) in cow manure. The method
89 proposes the use of a combination of 10 potential biomarkers for the detection of MAP. An algorithm
90 allows the differentiation of infected cows and non-infected cows giving a sensitivity of 76% and a
91 specificity of 80% for 31 cows. The results look promising; but more work needs to be done to improve
92 the accuracy of this diagnostic test.