

## Capturing the antimicrobial profile of *Rosmarinus officinalis* against methicillin-resistant *Staphylococcus aureus* (MRSA) with bioassay-guided fractionation and bioinformatics

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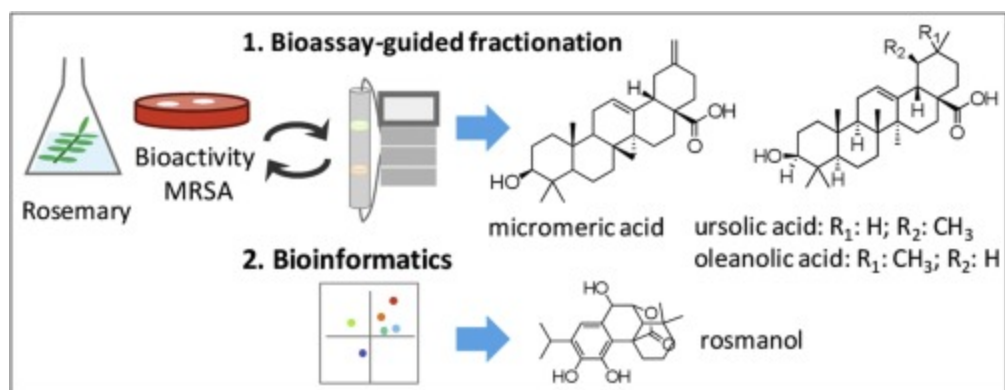


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### Abstract:

Natural products have been a primary source of medicines throughout the history of human existence. It is estimated that close to 70 % of small molecule pharmaceuticals on the market are derived from natural products. With increasing antibiotic resistance, natural products remain an important source for the discovery of novel antimicrobial compounds. The plant rosemary (*Rosmarinus officinalis*), has been widely and commonly used as a food preservative due to its antimicrobial potential. To evaluate the antimicrobial profile of this plant, we used bioassay-guided fractionation and bioinformatics approaches. Through bioassay-guided fractionation, we tested *in vitro* activities of a *R. officinalis* extract and fractions thereof, as well as pure compounds micromeric acid (**1**), oleanolic acid (**2**), and ursolic acid (**3**) against methicillin-resistant *Staphylococcus aureus* (MRSA). Compounds **1** and **3** showed complete inhibition of MRSA (with MIC values of 32 µg/mL and 8 µg/mL, respectively) while compound **2** displayed only partial inhibition (MIC > 64 µg/mL). In addition, we utilized orthogonal partial least square-discriminant analysis (OPLS-DA) and selectivity ratio (SR) analysis to correlate the isolated compounds **1-3** with the observed antimicrobial activity, as well as to identify antimicrobials present in trace quantities. For mass spectrometry (MS) data collected in the negative ionization mode, compound **1** was the most positively correlated with activity, while for MS data collected in the positive ion mode, compounds **2-3** had the highest positive correlation. Using the bioinformatics approaches, we highlighted additional antimicrobials associated with the antimicrobial activity of *R. officinalis*, including genkwanin (**4**), rosmadial (**5a**) and/or 16-hydroxyrosmadial (**5b**), rosmanol (**6**), and hesperetin (**7**). Compounds **1-3** resulting from the bioassay-guided fractionation were identified by MS-MS fragmentation patterns and <sup>1</sup>H NMR spectra. Among the compounds highlighted by the biochemical analysis, compound **6** was identified by comparison with its commercial standard by employed ultra-performance liquid chromatography-high resolution mass spectrometry (UHPLC-HRMS), while **4**, **5a-b** and **7** were putatively identified based on MS data and in comparison with the literature. This is the first reported antimicrobial activity of micromeric acid (**1**) against MRSA.



**Keywords:** *Rosmarinus officinalis* | Rosemary | Bioassay-guided fractionation | Bioinformatics | Biochemometrics | MRSA | Natural products

## Article:

### 1. Introduction

The use of natural products, including medicinal plants, remains widely popular today with approximately 80 % of the world's population relying on herbal products and related supplements as part of their health care regimen [1]. *Rosmarinus officinalis* L., or rosemary, synonymously known as *Salvia rosmarinus* Spenn., is an aromatic shrubby herb that is a member of Lamiaceae, native to the Mediterranean region [2]. *R. officinalis* extract has been reported to demonstrate antimicrobial activity against the bacterial pathogen methicillin-resistant *Staphylococcus aureus* (MRSA), although the chemical compounds responsible for that activity were not identified [3]. According to the 2019 CDC report, MRSA is one of the most common antibiotic-resistant bacterial pathogens and is estimated to cause more than 323,000 cases and 10,600 deaths annually in the United States alone [4].

In this study, our goal was to use two different approaches, bioassay-guided fractionation and bioinformatics, to evaluate the antimicrobial profile of *R. officinalis* against MRSA USA300 LAC strain AH1263 [5], with the long-term objective being the utilization of this combination approach to efficiently improve the antimicrobial screening processes in natural products.

Bioassay or bioactivity-guided fractionation has been the gold standard in natural products, in which the extracts are subjected to chemical fractionations and bioassays to simplify the complexity and pinpoint certain compounds with significant biological effects [6]. It was reported in 2012 that bioassay-guided fractionation was used in more than 1500 published articles in *ISI Web of Science*, with hundreds more citations applying various forms of the same method [6]. While the bioassay-guided fractionation method can be employed to effectively isolate the most abundant antimicrobials, it also comes with several limitations in that the botanical materials contain thousands of individual compounds and the methodology tends to overlook some of the bioactive constituents that are present in low amounts [7].

Here we sought to demonstrate the use of bioinformatics approaches to correlate the chemical constituents with the bioactivity of *R. officinalis* and identify the additional antimicrobials that are not identified through bioassay-guided fractionation. Both orthogonal partial least square-discriminant analysis (OPLS-DA) and selectivity ratio (SR) analysis were utilized toward this goal. OPLS-DA is an extension of partial least square-discriminant analysis (PLS-DA) and utilizes orthogonal signal correction filter to remove variabilities that are not appropriate to the dataset, which in turn allows the analysis to be targeted and robust against noise [7]. SR plots compare the correlation and covariance to the residual variance and provide a numerical scale to differentiate between constituents that correlate with biological activity and those that do not [8].

## 2. Experimental

### 2.1. General experimental procedures

UHPLC-HRMS analysis was completed using a Thermo-Fisher Q-Exactive Plus Orbitrap mass spectrometer (Thermo Fisher Scientific, Waltham, MA, USA) connected to an Acquity UPLC system (Waters, Milford, MA, USA) with a reverse phase UPLC column (BEH C18, 1.7  $\mu\text{m}$ , 2.1  $\times$  50 mm, Waters Corporation, Milford, MA, USA). All fractions were analyzed at 0.1 mg mL<sup>-1</sup> in MeOH with 5  $\mu\text{L}$  injections. The gradient was comprised of solvent A (H<sub>2</sub>O with 0.1 % formic acid) and solvent B (acetonitrile with 0.1 % formic acid). The gradient began with 90:10 (A:B) from 0–0.5 min, and increased linearly to 0:100 (A:B) over 19.5 min, then it was held at 100 % B for 0.5 min, before returning to starting conditions over 0.5 min with an isocratic hold from 21.0 to 22.0 min. Analysis was performed in positive and negative switching mode over the *m/z* range of 150–1500 with: capillary voltage at -0.7 V, capillary temperature at 310 °C, S-lens RF level at 80.00, spray voltage at 3.7 kV, sheath gas flow at 50.15, and auxiliary gas flow at 15.16. The three most intense ions were fragmented with a higher-energy collisional dissociation (HCD) of 65.0. Flash chromatography was conducted with a CombiFlash RF system (Teledyne-Isco) with a photo-diode array (PDA) detector. The HPLC separations were performed with a preparative Gemini (5  $\mu\text{m}$ ; 250  $\times$  21.20 mm) column, at a flow rate of 21.2 mL/min, with a Varian Prostar HPLC system (Agilent, Santa Clara, CA, USA) equipped with a Prostar 210 pumps and a Prostar 335 photodiode array detector (PDA), with the collection and analysis of data using Galaxie Chromatography Workstation software. The NMR data was collected using a JOEL ECS-400 spectrometer, which was equipped with a JOEL normal geometry broadband Royal probe, and a 24-slot autosampler, and operated at 400 MHz for <sup>1</sup>H (JOEL USA, Inc.) All analytes including oleanolic acid, ursolic acid, and rosmanol standards were acquired through Sigma-Aldrich (St. Louis, MO, USA) and were spectroscopic or microbiological grade. All solvents were purchased from Fisher Scientific (Waltham, MA, USA), in Optima or HPLC or ACS-grade dependent upon the experiment.

### 2.2. Plant material

*Rosmarinus officinalis* L. was collected on July 25, 2019 from the Dunleath Community Garden in Guilford County, North Carolina (N 36°4'53.616", W 79°47'6.18"). The voucher specimen was deposited at the herbarium at the University of North Carolina at Chapel Hill (Accession number NCU670047, Catalog number NCU00433752). Stems and leaves were dried at room

temperature until crisp before extraction. The plant name was verified on <http://www.theplantlist.org/> on August 10th, 2020.

### 2.3. Extraction

*R. officinalis* stems and leaves (30.60 g of dried mass) were ground using a Wiley Mill Standard Model No. 3 (Arthur Thomas Company) and extracted in MeOH (160 g/L) at room temperature for 24 h. The supernatant MeOH layer in the extract was decanted using a borosilicate glass side-arm flask and funnel. The supernatant was dried down using a Rotovap (Heidolph, Schwabach, Germany). The MeOH was recycled to repeat the process for a total of three times. The MeOH extract was dried under nitrogen, yielding 3.2 g.

### 2.4. Chromatographic separation

The fractionation scheme is provided in Figure S1. A portion of the methanol extract (900 mg) was dissolved in CHCl<sub>3</sub>, adsorbed onto Celite 545 (Acros Organics) and was separated with normal-phase flash chromatography (40 g silica gel column) with a 55.0-minute hexane/CHCl<sub>3</sub>/MeOH gradient at a 40 mL/min flow rate (Figure S4). This generated a total of 8 fractions. Fraction RO-5 (115 mg) went through a second stage of normal-phase flash chromatography (Figure S5), after dissolving in chloroform, absorbing onto Celite 545 (Acros Organics), with a 35.0-minute hexane/CHCl<sub>3</sub>/MeOH gradient and was separated using a 15.5 g silica gel column at a flow rate of 30 mL/min. This fractionation yielded 6 simplified fractions, in which the bioactive fraction RO-5-4 (approximately 10 mg) was purified further via preparative HPLC using a gradient system 80:20 to 90:10 of CH<sub>3</sub>CN:H<sub>2</sub>O with 0.1 % formic acid over 30 min (Figure S6). This yielded 4 fractions: RO-5-4-1 (3.88 mg eluted at 4.0 min), RO-5-4-2 (2.27 mg eluted at 12.5 min), RO-5-4-3 (3.15 mg eluted at 15.9 min), and RO-5-4-4 (5.4 mg eluted at 0.5 min).

### 2.5. Antimicrobial assays

Antimicrobial activity was evaluated according to Clinical Laboratory Standards Institute (CLSI) guidelines [9] against a clinically relevant strain of methicillin resistant *S. aureus* (MRSA USA300 LAC strain AH1263) [5]. Cultures were grown from a single colony isolate in Müller-Hinton broth (MHB) and diluted to  $1.0 \times 10^5$  CFU/mL based on absorbance at 600 nm (OD<sub>600</sub>).

Samples were screened in triplicates at final concentrations of 10 and 100 µg/mL. Samples were dissolved in DMSO and diluted with MHB to prepare final concentrations containing 2% DMSO in each well of 96-well cell culture plate (Corning Incorporated, Corning, NY, USA).

Minimal inhibitory concentrations (MICs) were identified by testing micromeric acid (**1**), oleanolic acid (**2**), and ursolic acid (**3**) in 96-well cell culture plate (Corning Incorporated, Corning, NY, USA) at concentration ranging from 0.00 to 64.0 µg/mL in MHB. MIC was defined as the lowest concentration at which no statistically significant difference between the wells that did not contain bacteria and the treated samples were found. In both screening and MIC assays, levofloxacin (98 % purity, Sigma-Aldrich) was used as a positive control at 10 µg/mL while 2% DMSO served as a negative control. The samples were incubated while shaken at 37 °C for approximately 18–24 h and OD<sub>600</sub> values were measured using a Synergy H1

microplate reader (Biotek, Winooski, VT, USA). Percent inhibition and MIC values were calculated based on the CLSI standard protocols [9].

## 2.6. Bioinformatics analysis

Raw data were converted to mzML format with Proteowizard (<http://proteowizard.sourceforge.net/>). MZmine 2.53 software (<http://mzmine.github.io/>) was employed for data processing. In both ionization modes, the exact mass detector was used for mass detection with a noise level set at  $5 \times 10^3$ . The ADAP chromatogram builder [10] was set to a minimum group size scan of 5, a minimum group intensity threshold of  $5 \times 10^3$ , a minimum highest intensity of  $1 \times 10^4$  and a  $m/z$  tolerance of 0.003 Da. The wavelet algorithm ADAP was used for deconvolution: the intensity window was used as signal to noise (S/N) estimator, the S/N threshold was set at 10, the minimum feature height at  $1 \times 10^5$ , the coefficient area threshold at 110, a peak duration range of 0.0–1.0 min, and a retention time wavelet range of 0.0 to 0.1 min. The peak lists were de-isotoped with the isotope peaks grouper with a  $m/z$  tolerance of 0.015 Da, a retention time (RT) tolerance of 0.01 min, a maximum charge of 3 and the most intense isotope was the representative one. Each series of triplicates was aligned independently with the Join aligner method, with a RT tolerance of 0.1 min, a  $m/z$  range of 0.002, a weight for RT of 1 and for  $m/z$  of 2. The obtained aligned peak lists were filtered with the feature list row filter module to keep only rows that have features detected in each replicate. After filtering, these peak lists were all aligned together as well as with the blank analyses ( $n = 7$ ) with the same parameters. Rows with features detected in more than 4 blank analyses were removed. For further analysis, the peak areas,  $m/z$  values, and retention times for detected individual ions in triplicate injections were exported from the data matrix to Excel (Microsoft, Redmond, WA, USA). A peak area of 0 was assigned to the samples that did not contain a particular marker ion, to maintain a consistent number of variables throughout the dataset. The dataset is available on the GNPS server (MassIVE MSV000086110, <https://doi.org/doi:10.25345/C5XB4V>). It includes raw and mzML files, as well as the resulting tables exported from MZmine.

The averages of triplicate injections were used after verifying that replicates clustered in the dendrogram analysis (Figure S7 and S8). The resulting data matrix from Excel (Microsoft, Redmond, WA, USA) was merged with bioactivity data set in the form of percent inhibition against MRSA (at 100  $\mu\text{g/mL}$  concentration) to form a final analytical matrix. Biochemometric analysis was performed using Sirius version 11.5 (Pattern Recognition Systems AS, Bergen, Norway). An internally cross-validated PLS (partial least squares) model was constructed using 100 iterations, at a significance level of 0.010. Selectivity ratios from the final PLS model were calculated using algorithms internal to Sirius.

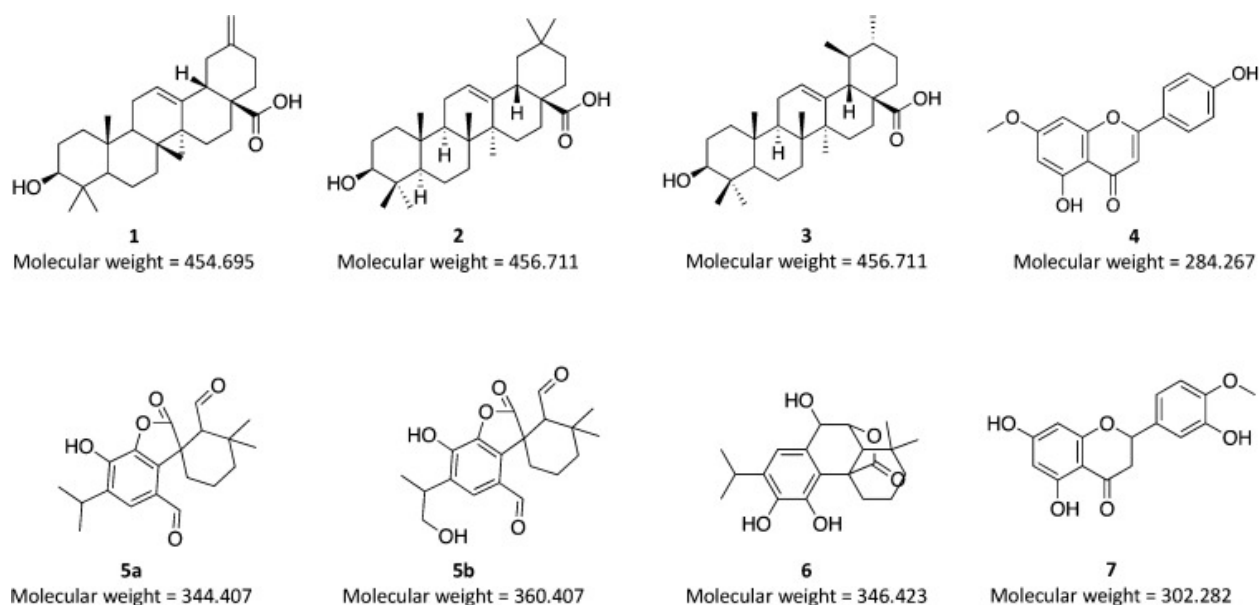
Features of interest were annotated by combining the determination of the molecular formula and data from the literature. In the module for predicting the molecular formulae of MZmine, the  $m/z$  tolerance was set at 0.002 Da, the isotopic score at a minimum of 60 % and the element count heuristics were taken into account. The CAMERA identification module was used with the parameters described in [https://mzmine.github.io/ADAP\\_user\\_manual.pdf](https://mzmine.github.io/ADAP_user_manual.pdf). In addition, the identification module for adduct search was used with a RT tolerance set at 0.02 min, a  $m/z$  tolerance at 0.0015 Da and a maximum relative adduct peak height at 10,000 %. To complete the list of adducts included in MZmine, common adducts described

in <https://fiehnlab.ucdavis.edu/staff/kind/metabolomics/ms-adduct-calculator/> were imported in the module.

### 3. Results and discussion

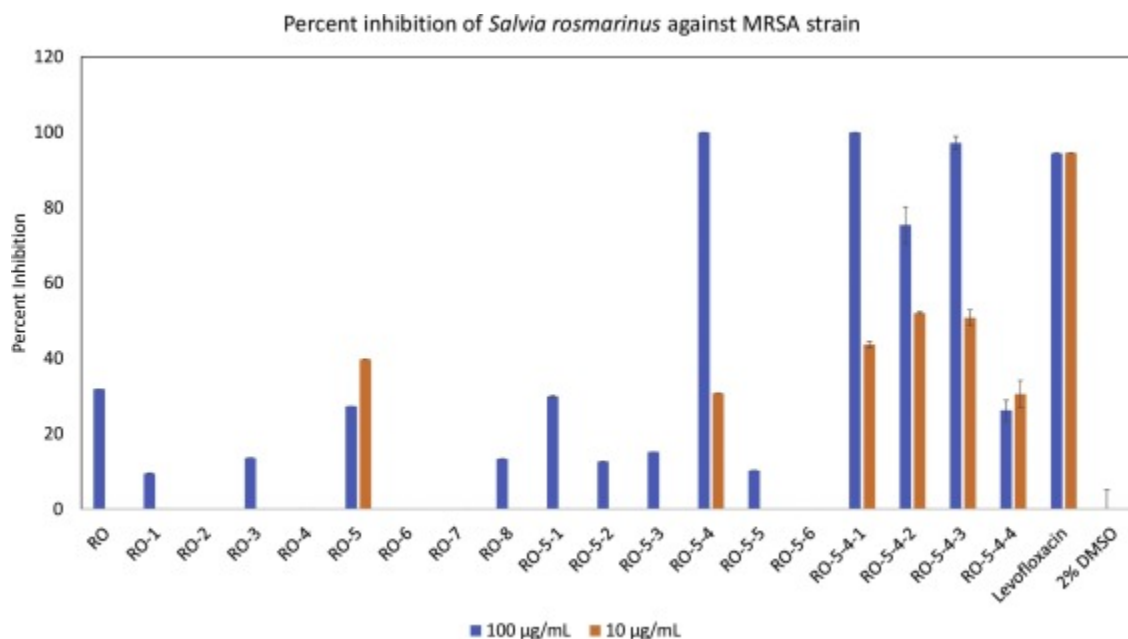
#### 3.1. Bioassay-guided fractionation approach

Bioassay-guided fractionation was completed in three stages (Figure S1) to simplify the *R. officinalis* extract. With each stage, bioactive constituents were concentrated further, resulting in the elevated percent inhibition values (Fig. 2), most significantly going from first stage to second stage fractions. The most bioactive second stage fraction (RO-5-4) was chromatographically separated and resulted in four subfractions, in which three (RO-5-4-1 through RO-5-4-3) of them demonstrated significant inhibitions ranging from 75 to 100% against MRSA strain (Figs. 2 and S1). MS-MS (Figure S2) and  $^1\text{H}$  NMR (Figure S3) analyses were acquired. RO-5-4-1 was confirmed to be compound **1** by  $^1\text{H}$  NMR in comparison to the literature (Figs. 1, S3A, and S3B) [11]. RO-5-4-2 and RO-5-4-3 were found to contain compounds **2** and **3**, respectively, in comparison to the fragmentation patterns (Figure S2) and  $^1\text{H}$  NMR spectra (Figure S3) of the standards [12,13]. In particular, RO-5-4-2 had two methyl singlets ( $\delta_{\text{H}}$  0.89 and  $\delta_{\text{H}}$  0.92), where RO-5-4-3 had the corresponding methyl doublets ( $\delta_{\text{H}}$  0.85, and  $\delta_{\text{H}}$  0.93). While RO-5-4 fraction had MIC value of 32  $\mu\text{g}/\text{mL}$ , compounds **1** and **3** showed antimicrobial activities against MRSA with MIC values of 32  $\mu\text{g}/\text{mL}$  (70  $\mu\text{M}$ ) and 8  $\mu\text{g}/\text{mL}$  (18  $\mu\text{M}$ ) respectively. Compound **2** only demonstrated partial inhibition of MRSA (MIC > 64  $\mu\text{g}/\text{mL}$  (140  $\mu\text{M}$ )). This is the first reported antimicrobial activity of **1** against MRSA. Compounds **2** and **3** have previously been reported to have activity against *S. aureus* strain ATCC 25923, with MIC values of 3.75 mg/mL and 0.01 mg/mL, respectively [14]. Hence, the bioassay-guided fractionation enabled identification of two antimicrobial constituents (**1** and **3**) present in the most active second stage fraction, RO-5-4 (Figure S2), and also resulted in the isolation of compound **2** with very weak activity.



**Fig. 1.** Structures of isolated compounds: micromeric acid (**1**), oleanolic acid (**2**) and ursolic acid (**3**) and structures of putatively identified compounds: genkwainin (**4**), rosmadial (**5a**), 16-

hydroxyrosmedial (**5b**), rosmanol (**6**), and hesperetin (**7**) from *Rosmarinus officinalis*. Configuration of compounds **1-3** was assigned via  $^1\text{H}$  NMR. The annotation of compound **6** was validated by comparison with a commercial standard by UHPLC-HRMS, while others were tentatively identified through  $m/z$  and RT values and in comparison with the literature. Molecular weights of the compounds (in g/mol) are denoted below each structure.



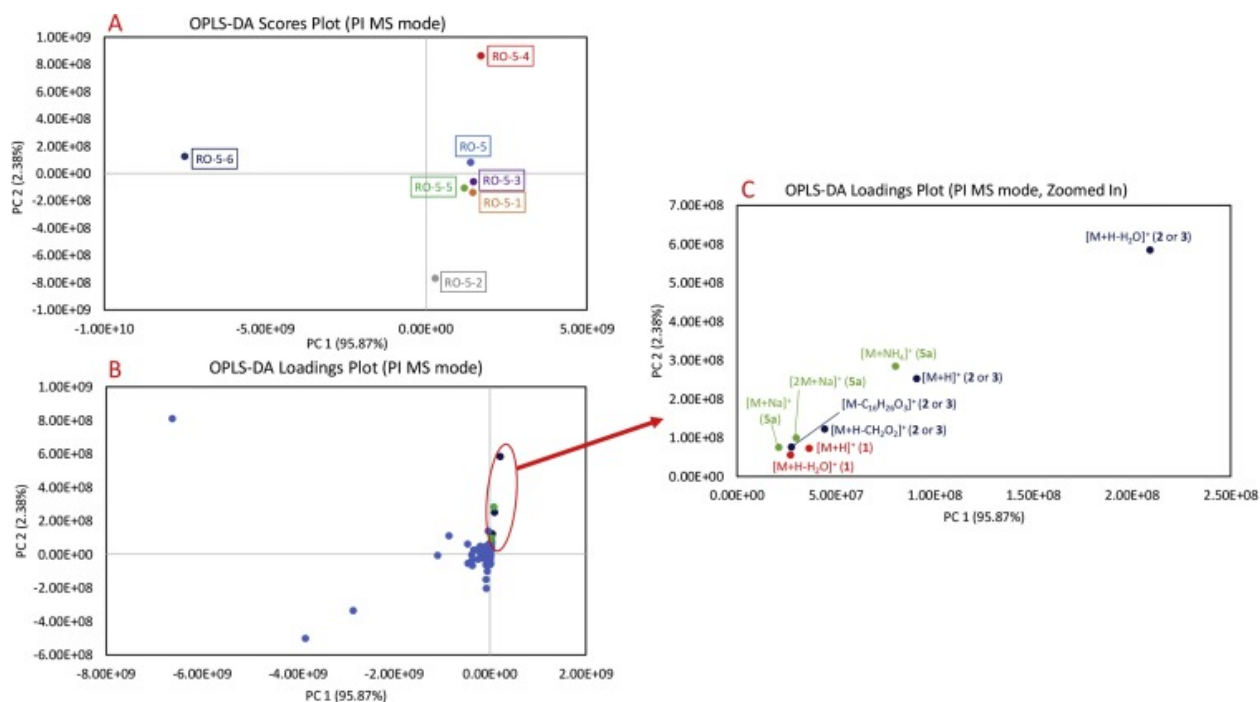
**Fig. 2.** Percent inhibition of methicillin resistant *Staphylococcus aureus* (MRSA) strain AH1263 growth by *Rosmarinus officinalis* methanol extract (RO) and fractions thereof. The fractionation scheme can be seen in Figure S1. The initial extract (RO) exhibited partial inhibition at high concentration (100 µg/mL) but no inhibition at low concentration (10 µg/mL). Fractionation of the initial extract (RO) yielded eight fractions (RO-1 through RO-8), of which one fraction (RO-5) possessed strong antimicrobial activity. Fraction RO-5 was subsequently fractionated into six sub-fractions (RO-5-1 through RO-5-6), of which RO-5-4 was active. Fraction RO-5-4 was separated into four sub-fractions, RO-5-4-1 through RO-5-4-4, all of which exhibited significantly high inhibitions of MRSA growth at 100 µg/mL. Mean percent inhibition was calculated from triplicate assays wells and error bars represent standard error of the triplicates. The known antimicrobial agent levofloxacin served as positive control, and vehicle (2% DMSO) served as negative control.

### 3.2. Bioinformatics approach

We employed UHPLC-HRMS to evaluate differences in chemical compositions of the first stage fraction with the most potent antimicrobial activity (RO-5) and its subfractions (RO-5-1 through RO-5-6) (Figure S1) at 100 µg/mL concentrations. Only these fractions of *R. officinalis* were included since the second stage fractions were previously found to be the most effective for the bioinformatics process [15].

To perform bioinformatics, the chemical information came from MS analysis in the form of mass over charge-retention time ( $m/z$ -RT) pairs and antimicrobial assays provided the required percent

inhibition values (Fig. 2). Both OPLS-DA (Figs. 3 and 4) and SR plot (Fig. 5) analyses were performed on the MS data sets collected in the positive ionization and negative ionization modes.

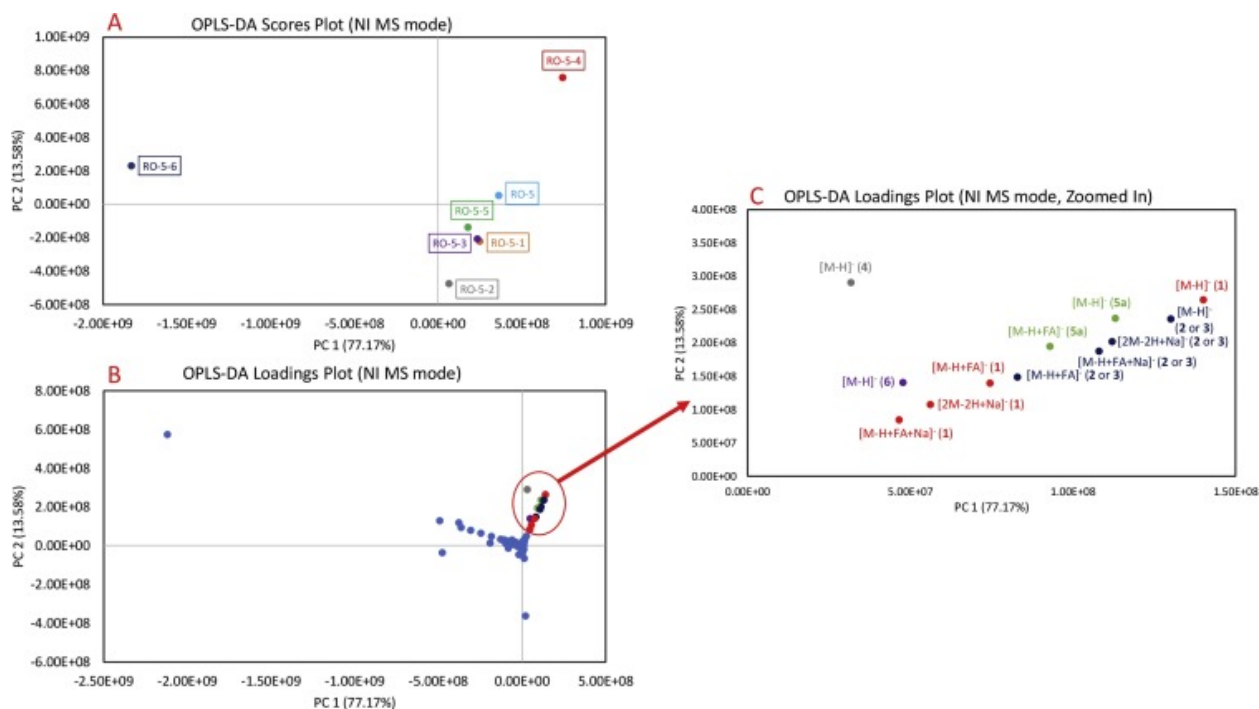


**Fig. 3.** OPLS-DA plots of *Rosmarinus officinalis* fractions (first stage RO-5 fraction and its subfractions, RO-5-1 through RO-5-6) in positive (PI) MS mode. The separation pattern of the data points is supervised by the percent inhibition values against MRSA. **3A.** OPLS-DA scores plot of the fractions. Each fraction is plotted as an individual data point and color-coded. RO-5-4 having the highest inhibition against MRSA is visualized in the quadrant I, while RO-5-6 with no inhibition against MRSA is in the quadrant II. Other fractions with moderate bioactivities cluster closely to one another near the center of the plot. **3B.** OPLS-DA loadings plot of the fractions. The detected features, which exist in the same quadrant as RO-5-4, are clustered in the quadrant I and their presence is highly correlated to the bioactivity of the fraction. **3C.** OPLS-DA loadings plot, zoomed in on the features correlating to the bioactivity. The features are color-coded based on the compounds. Features corresponding to micromeric acid (1) and oleanolic acid (2) or ursolic acid (3) were identified to be positively correlating to the bioactivity of RO-5-4.  $[M+H+H_2O]^+$  of oleanolic acid (2) or ursolic acid (3) was identified to be the most positively correlated ion to the bioactivity of RO-5-4. Additional tentative annotations of the features can be seen in Table 1.

OPLS-DA is a supervised methodology that was employed here to integrate mass spectrometry datasets, which provide information on the chemical constituents, and bioactivity assays, which give percent inhibition values against MRSA. This analysis can be described in two plots, “scores” (Fig. 3A) in which each fraction represents a single data point and “loadings” (Fig. 3B) in which each individual features ( $m/z$ -RT pairs) found in the analyzed fractions are plotted as single data points [7]. The plots involve mapping the dataset onto a series of latent variables in a two-dimensional space [7]. Although more than two principal components (PC) exist, it is typical to plot data using the two PCs (often PC1 and PC2) that introduce the most variability across the analyzed fractions [7]. The location of the detected chemical constituent on the



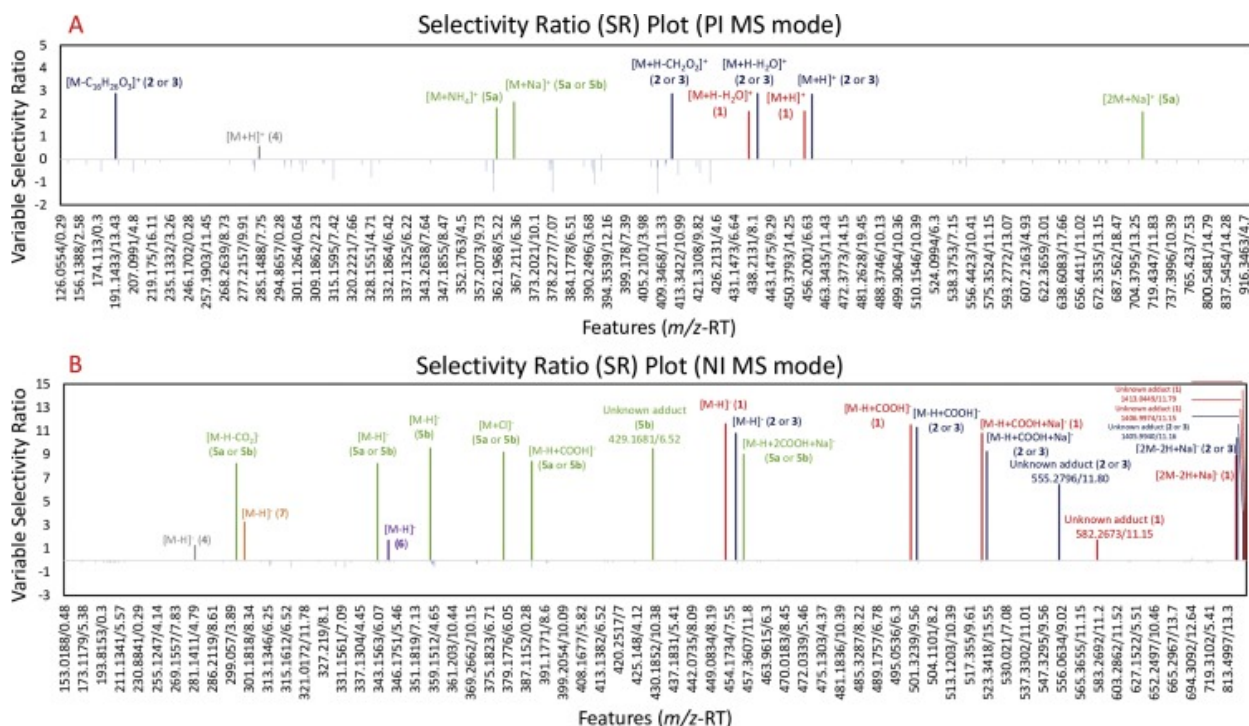
loadings plot explains the locations of the fractions on the corresponding scores plot, which in turn assists in the identification of bioactive compounds which correlate to the observed antimicrobial activities [7].



**Fig. 4.** OPLS-DA plots of *Rosmarinus officinalis* fractions (first stage RO-5 fraction and its subfractions, RO-5-1 through RO-5-6) in negative (NI) MS mode. The separation pattern of the data points is supervised by the percent inhibition values against MRSA. **3A.** OPLS-DA scores plot of the fractions. Each fraction is plotted as an individual data point and color-coded. RO-5-4 having the highest inhibition against MRSA is visualized in the quadrant I, while RO-5-6 with no inhibition against MRSA is in the quadrant II. Other fractions with moderate bioactivities cluster closely to one another near the center of the plot. **3B.** OPLS-DA loadings plot of the fractions. The detected features, which exist in the same quadrant as RO-5-4, are clustered in the quadrant I and their presence is highly correlated to the bioactivity of the fraction. **3C.** OPLS-DA loadings plot, zoomed in on the features correlating to the bioactivity. The features are color-coded based on the compounds. Similar to the positive mode, micromeric acid (1), oleanolic acid (2) or ursolic acid (3), and their adducts were identified to be positively correlating to the bioactivity of RO-5-4. The precursor ion  $[M-H]^-$  of micromeric acid (1) was identified as the most positively correlated ion to the bioactivity of RO-5-4. Additional tentative annotations of the features can be seen in Table 1.

In both positive and negative ionization modes, PC1 explains the differences between the fractions and detected ions more than PC2 due to the higher percentage: Fig. 3 (PC1 = 95.87 %, PC2 = 2.38 %) and Fig. 4 (PC1 = 77.17 %, PC2 = 13.58 %). Since OPLS-DA is guided by the MRSA growth inhibition values, the fraction with most potent antimicrobial activity, RO-5-4, clusters by itself in the quadrant I, the fraction with the least potent antimicrobial activity, RO-5-6 clusters by itself in the quadrant II, while other partially inhibitory fractions cluster together in the centers of the scores plots (Figs. 3A and 4A). Similarly, in the loading plots (Figs. 3B

and 4B), we observed that the features correlating to the antimicrobial activity of RO-5-4 cluster in the quadrant I.



**Fig. 5.** Selectivity ratio (SR) plot for multivariate statistical analysis for ions detected in first stage RO-5 fraction and its subfractions, RO-5-1 through RO-5-6. The data was collected using UPLC-HRMS. Percent inhibition measurements against MRSA after 18-24 h were used as a dependent variable. The x-axis shows the features (identified by a unique  $m/z$  and retention time) detected in the metabolomics dataset. Features are shown in the order of increasing  $m/z$  value and color-coded based on compounds. Variable selectivity ratio is shown on the y-axis and higher ratio indicates stronger correlation with the percent inhibition. **5A.** SR plot analysis in positive (PI) MS mode. **5B.** SR plot analysis in negative (NI) MS mode. In both figures, micromeric acid in red (1), oleonic acid (2) or ursolic acid (3) in blue, and their related features had high SR ratios, confirming their positive correlation to the bioactivity of RO-5-4 fraction. Unknown adducts are labelled along with their features ( $m/z$ -RT). Additional tentative annotations of the features can be seen in Table 1 (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article).

We identified nine features in positive ionization mode analysis (Fig. 3C) and twelve features in negative ionization mode analysis (Fig. 4C), which correlate to antimicrobial activity of RO-5-4. As compounds 2 and 3 are very similar structurally, they have been observed as co-eluting in our chromatographic conditions and they could not be differentiated. Compounds 1 and 2-3, and their in-source features (adducts and neutral losses) were identified to be the features of importance. In the positive ionization mode, the  $[M+H-H_2O]^+$  neutral loss of 2-3 was the most positively correlating feature in positive ionization mode (Fig. 3C) and in the negative ionization mode, the deprotonated molecular ion  $[M-H]^-$  of 1 was the highest correlating feature in negative ionization mode to the observed bioactivity of RO-5-4 (Fig. 4C). This further validates the results from the bioassay-guided fractionation approach since compounds 1-3 were isolated

from RO-5-4 (Figure S1) and exhibited antimicrobial activity when tested in isolation. More features corresponding to the compounds (4-6) were highlighted which will be discussed more in the SR analysis section (Figs. 3C and 5C). Detailed annotations of the features can be seen in Table 1 for both positive and negative ionization modes.

**Table 1.** Identifications and annotations of the features with positive selectivity ratios (SR) in UPLC-HRMS.

Positive Ionization (PI) MS mode									
Identifications/Annotations	SR	Loadings <sup>a</sup>	<i>m/z</i>	RT (min)	Ion description <sup>b</sup>	Molecular Formula	Reference	MSI <sup>c</sup>	
oleanolic acid (2) and ursolic acid (3)	2.88	Y	439.3576	11.80	[M+H-H <sub>2</sub> O] <sup>+</sup> ( <i>m/z</i> -18.010865)	C <sub>30</sub> H <sub>46</sub> O <sub>2</sub>			
oleanolic acid (2) and ursolic acid (3)	2.88	Y	191.1797	11.80	[M-C <sub>16</sub> H <sub>26</sub> O <sub>3</sub> ] <sup>+</sup> ( <i>m/z</i> -266.1887)	C <sub>14</sub> H <sub>22</sub>			
oleanolic acid (2) and ursolic acid (3)	2.87	Y	411.3627	11.80	[M+H-CH <sub>2</sub> O <sub>2</sub> ] <sup>+</sup> ( <i>m/z</i> -46.005480)	C <sub>29</sub> H <sub>46</sub> O			
oleanolic acid (2) and ursolic acid (3)	2.85	Y	457.3684	11.80	[M+H] <sup>+</sup>	C <sub>30</sub> H <sub>48</sub> O <sub>3</sub>	[12]		1
rosmadial (5a)	2.51	Y	367.1523	6.52	[M + Na] <sup>+</sup> ( <i>m/z</i> +21.98194)	C <sub>20</sub> H <sub>24</sub> O <sub>5</sub>	[21]		3
rosmadial (5a)	2.24	Y	362.1968	6.52	[M + NH <sub>4</sub> ] <sup>+</sup> ( <i>m/z</i> +17.02655)	C <sub>20</sub> H <sub>24</sub> O <sub>5</sub>			
micromeric acid (1)	2.11	Y	455.3525	11.19	[M+H] <sup>+</sup>	C <sub>30</sub> H <sub>46</sub> O <sub>3</sub>	[11]		1
micromeric acid (1)	2.09	Y	437.3422	11.20	[M+H-H <sub>2</sub> O] <sup>+</sup> ( <i>m/z</i> -18.010865)	C <sub>30</sub> H <sub>44</sub> O <sub>2</sub>			
rosmadial (5a)	2.07	Y	711.3148	6.52	[2M + Na] <sup>+</sup>	C <sub>40</sub> H <sub>48</sub> O <sub>10</sub>			
genkwainin (4)	0.56	N	285.0762	6.30	[M+H] <sup>+</sup>	C <sub>16</sub> H <sub>12</sub> O <sub>5</sub>	[22]		2
Negative Ionization (NI) MS mode									
Identity/ annotation	SR	Loadings <sup>a</sup>	<i>m/z</i>	RT (min)	Ion description	Molecular Formula	Reference	MSI <sup>c</sup>	
micromeric acid (1)	11.6	Y	453.3389	11.15	[M-H] <sup>-</sup>	C <sub>30</sub> H <sub>46</sub> O <sub>3</sub>	[11]		1
micromeric acid (1)	11.5	Y	499.3446	11.15	[M + COOH] <sup>-</sup> ( <i>m/z</i> +46.00547)	C <sub>30</sub> H <sub>46</sub> O <sub>3</sub>			
oleanolic acid (2) and ursolic acid (3)	11.3	Y	501.3601	11.80	[M + COOH] <sup>-</sup> ( <i>m/z</i> +46.00547)	C <sub>30</sub> H <sub>48</sub> O <sub>3</sub>			
oleanolic acid (2) and ursolic acid (3)	10.8	Y	455.3542	11.80	[M-H] <sup>-</sup>	C <sub>30</sub> H <sub>48</sub> O <sub>3</sub>	[12]		1
micromeric acid (1)	10.8	Y	521.3262	11.15	[M-H + NaCOOH] <sup>-</sup> ( <i>m/z</i> +67.987425)	C <sub>30</sub> H <sub>46</sub> O <sub>3</sub>			
oleanolic acid (2) and ursolic acid (3)	10.4	Y	933.6978	11.81	[2M-2H + Na] <sup>-</sup>	C <sub>60</sub> H <sub>64</sub> O <sub>6</sub>			
16-hydroxyrosmadial (5b)	9.54	N	359.1511	6.52	[M-H] <sup>-</sup>	C <sub>20</sub> H <sub>24</sub> O <sub>6</sub>	[23]		3
unknown feature [16-hydroxyrosmadial (5b)]	9.5	N	429.1681	6.52	-	-			
oleanolic acid (2) and ursolic acid (3)	9.25	Y	523.3418	11.80	[M-H + NaCOOH] <sup>-</sup> ( <i>m/z</i> +67.987425)	C <sub>31</sub> H <sub>48</sub> O <sub>5</sub>			
rosmadial (5a)	9.19	N	379.133	6.52	[M + Cl] <sup>-</sup> ( <i>m/z</i> +35.976678)	C <sub>22</sub> H <sub>26</sub> O <sub>9</sub>			
rosmadial (5a)	9	N	457.1494	6.52	[M-H+2HCOO + Na] <sup>-</sup> ( <i>m/z</i> +113.992905)	C <sub>22</sub> H <sub>26</sub> O <sub>9</sub>			
micromeric acid (1)	8.9	Y	929.6664	11.15	[2M-2H + Na] <sup>-</sup>	C <sub>60</sub> H <sub>90</sub> O <sub>6</sub>			
rosmadial (5a)	8.4	Y	389.1619	6.52	[M + COOH] <sup>-</sup> ( <i>m/z</i> +46.00547)	C <sub>20</sub> H <sub>24</sub> O <sub>5</sub>			
rosmadial (5a)	8.23	Y	343.1561	6.52	[M-H] <sup>-</sup>	C <sub>20</sub> H <sub>24</sub> O <sub>5</sub>	[21]		3
rosmadial (5a)	8.22	N	299.1662	6.52	[M-H-CO <sub>2</sub> ] <sup>-</sup> ( <i>m/z</i> -43.989830)	C <sub>19</sub> H <sub>24</sub> O <sub>3</sub>			
unknown feature [oleanolic acid (2) and ursolic acid (3)]	6.43	N	555.2796	11.80	-	-			
unknown feature [micromeric acid (1)]	4.13	N	1405.994	11.16	-	-			
unknown feature [oleanolic acid (2) and ursolic acid (3)]	4.13	N	1406.997	11.15	-	-			
unknown feature [oleanolic acid (2) and ursolic acid (3)]	4.13	N	1413.045	11.79	-	-			
hesperetin (7)	3.23	N	301.073	4.58	[M-H] <sup>-</sup>	C <sub>16</sub> H <sub>14</sub> O <sub>6</sub>	[24]		2

Negative Ionization (NI) MS mode								
Identity/ annotation	SR	Loadings <sup>a</sup>	<i>m/z</i>	RT (min)	Ion description	Molecular Formula	Reference	MSI <sup>c</sup>
unknown feature [micromeric acid (1)]	1.72	N	582.2673	11.15	–			
rosmanol (6)	1.69	Y	345.1716	5.82	[M-H] <sup>-</sup>	C <sub>20</sub> H <sub>26</sub> O <sub>5</sub>	[25]	1
genkwanin (4)	1.26	Y	283.062	6.30	[M-H] <sup>-</sup>	C <sub>16</sub> H <sub>12</sub> O <sub>5</sub>	[22]	2

<sup>a</sup> Features detected in the loading plots of OPLS-DA analysis. Y: detected in quadrant I, N: not detected in quadrant I.

<sup>b</sup> Annotations were performed with a *m/z* tolerance of 2 mDa.

<sup>c</sup> MSI: *Metabolomic Standard Initiative*, level of identification proposed in Sumner et al. 2007 [26].

Bioinformatics analysis can also be conducted using selectivity ratio (SR) analysis, which quantitatively measures the level of correlation between the observed biological effect and each of the features (*m/z*-RT pairs) in the dataset [8]. For this dataset, the higher (more positive) SR values represent positive correlations with antimicrobial activity. In the SR analysis for the positive ionization MS data set, the positive SR ranged from 0.56 to 2.88 (Fig. 5A). The two features with the highest SR (SR = 2.88), [M+H-H<sub>2</sub>O]<sup>+</sup> and [M-C<sub>16</sub>H<sub>26</sub>O<sub>3</sub>]<sup>+</sup>, were annotated as features of compounds **2** or **3** (Fig. 5A), further validating the OPLS-DA analysis (Fig. 3) which indicated that these compounds are highly correlated to the antimicrobial activity. In the negative ionization mode SR analysis, the positive SR ranged from 1.26 to 11.60 (Fig. 5B). The features with the highest SR values were annotated as features of compounds **1** and **2–3** (Fig. 5B), again validating the OPLS-DA analysis (Fig. 4).

In addition to the compounds already identified by the bioassay-guided fractionation approach, other compounds were highlighted by the biochemometric approach (Fig. 1). In both ionization modes, the precursor ions, [M+H]<sup>+</sup> and [M-H]<sup>-</sup>, of compound **4** were highlighted with positive SR values (Fig. 5). Furthermore, the SR plots showed features that could be related to compound **5a**; however, the presence of a feature at the same retention time in the negative ionization mode annotated as the [M-H]<sup>-</sup> deprotonated molecular ion of **5b** could indicate that all related features to compound **5a** came from compound **5b**, which would lose one oxygen during the ionization process (Fig. 5). In addition to these features, the negative ionization mode SR plot highlighted the [M-H]<sup>-</sup> deprotonated molecular ions of compounds **6** and **7**. The annotation of compound **6** was validated by comparison with a commercial standard by UHPLC-HRMS. These data are strengthened with literature comparison, as compound **6** has been previously shown to MICs ranging from 15.6 to 62.5 µg/mL against MRSA strains [16] and compound **7** has been shown to have MIC of 500 g/mL against MRSA [17] while compound **4** has previously been reported to have antimicrobial activity against *Bacillus cereus* and *Escherichia coli* strains although not against MRSA [18]. To our knowledge, no previous studies were conducted on the antimicrobial activities of compound **5a** or **5b** against MRSA. Detailed annotations including SR values can be seen in Table 1.

Previous reports have often attributed the antimicrobial activity of *R. officinalis* to volatile constituents that the plant contains [19]. While the analyses conducted here did not detect these constituents in the *R. officinalis* extract, it is possible that they could have been present below the limit of detection for UHPLC-HRMS and may have contributed to the observed antimicrobial activity of the extracts. Future experiments to explore this possibility, possibly employing gas chromatography-mass spectrometry as an analytical technique, would be warranted.

The bioinformatics approach enabled not only the identification of the highly positive correlations of **1-3** but also of compound **6**, which was not detected by the bioassay-guided fractionation approach. Furthermore, it allowed the putative annotations of compounds **4**, **5a** or **5b**, and **7** using their *m/z* and RT values and in comparison with the literature. Therefore, the combination of bioassay-guided fractionation and bioinformatics can lead to the isolation of abundant compounds, correlations of these compounds with bioactivity, and the highlighting of potential antimicrobials present in low quantities. This captures a more complete assessment of the antimicrobial profile of a given natural product than using either technique alone. Further studies would be required to confirm the identity of the annotated compounds and to evaluate their bioactivities individually and in combination via synergistic antimicrobial assays [20].

### **Authors' contributions**

Conceived and designed the experiments: MK JH NBC. Performed the experiments: MK. Analyzed the bioinformatics data: MK JH. Supervised the bioinformatics analysis: DDJ and JH. Assisted with the HPLC and NMR experiments: SLK. Ran the MIC assays for compounds **1-3**: WJC. Contributed reagents/materials/analysis tools: NBC. Wrote the manuscript: MK. Provided crucial suggestions about the experiments/manuscript: JH NBC SLK DDJ NHO.

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### **Declaration of Competing Interest**

The authors declare no competing interests.

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### **Appendix A. Supplementary data**

Supplementary material related to this article can be found online at <https://doi.org/10.1016/j.jpba.2021.113965>.

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