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Integrated UPLC-HRMS, Chemometric Tools, and Metabolomic Analysis of Forage Palm (*Opuntia* spp. and *Nopalea* spp.) to Define Biomarkers Associated with Non-Susceptibility to Carmine Cochineal (*Dactylopius opuntiae*)

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Metabolomics, together with analytical methods and chemometric tools, point to new paths for selecting species that are resistant to pests and diseases. In this work, the forage palm species' metabolomic profile was investigated, and the relation between the chemical composition and resistance to Dactylopius opuntiae (carmine cochineal). The study was performed in cladodes of different non-susceptible cultivars (Nopalea cochenillifera (L.) Salm-Dyck, Opuntia stricta (Haw.), Nopalea cochenillifera and susceptible cultivar (Opuntia ficus-indica (L.) Mill.)). Metabolic profile showed 28 metabolites detected in the four species. From these total, 18 metabolites were annotated using UPLC-QTOF-MS^E (ultra-performance liquid chromatography coupled with an electrospray ionization quadrupole time-of-flight mass spectrometry operating in MS^E mode). By comparing the chemical profiles of non-susceptible and susceptible species through the application of chemometric tools, it was possible to obtain biomarkers (quercetin-3-O-2',6'-dirhamnosylglucoside, quercetin rhamnosyl dihexoside, and isorhamnetin-3-sophoroside-7-rhamnoside) that may be associated with resistance to carmine cochineal. Metabolomics based on UPLC-QTOF-MSE and chemometric allowed to establish the biomarkers knowledge of the resistance present in forage palm species. These results contribute to developing the initial understanding of flavonoids' role in the defense mechanisms of cactaceans and can be useful for application in breeding programs; it can increase the chances of success in creating new varieties of plants not susceptible to carmine cochineal.

Keywords: Cactaceae, Dactylopius opuntiae, UPLC-QTOF-MS^E, chemometrics

Introduction

Some forage palm, among which *Opuntia* spp. and *Nopalea* spp. (Cactaceae family) are well adapted to the arid and semi-arid conditions; also, it has a wide variety of germplasm, being cultivated in all the continents, except in Antarctica.¹⁻⁸ In Brazil, mainly in semi-arid regions, it is considered one of the primary sources of forage for dairy cattle during the dry period of the year due to the high palatability. In addition to animal and human food, it can be used as an ornamental plant to prevent soil degradation

and control desertification, energy production, medicinal function, and a cosmetic composition.^{3-5,8}

Opuntia spp. and *Nopalea*'s chemical composition varies with cultivar, stage of development, fertilization, plant population, and cladode order. However, they have low content of dry matter (5-20%), the main constituent being water (80-95%), followed by small amounts of carbohydrates (3-7%), fibers (1-2%), and proteins (0.5-1%).⁹⁻¹¹ Besides these nutrients, it also presents a significant amount of minerals rich in Ca²⁺, Mg²⁺, Na⁺, K⁺, Fe²⁺,^{11,12} besides phenolic compounds and flavonoids, carotenoid, and vitamins.^{9-11,13-16}

Among the problematic pests that attack the crop, the carmine cochineal (*Dactylopius opuntiae*) (Hemiptera:

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Dactylopiidae) is a significant threat to forage palm because of its potential to render plants unviable economically. This insect produces carminic acid to protect itself from predators, which can be used in the cosmetic, food, pharmaceutical, and textile industries.^{17,18} In Brazil, *D. opuntiae* is considered a key crop pest. It weakens the plant and can cause chlorosis (yellowing) of rackets and the cladodes' fall.¹⁹ In more severe attacks, when no control measure is adopted, plant death may occur, and destruction of the whole plantation.¹⁸ Its control has been mainly carried out using insecticides. However, due to its high cost and possible environmental implications, it is difficult, mainly due to small rural producers' socio-economic conditions.

Thus, the best alternative for cultivating forage palm in regions attacked by this insect is planting resistant cultivars with resistance to carmine cochineal. Host plant resistance is an essential tool for integrated pest management (IPM). It is low-cost, more durable, and reduces the risk of developing resistant pests to registered active ingredients.²⁰ Resistance to *D. opuntiae* has already been observed in cultivars *Nopalea cochonellifera* (L.) Salm-Dyck, *Opuntia stricta* (Haw.) and *N. cochonellifera*, varieties cultivated in Brazil. On the other hand, the giant forage palm cultivar (*Opuntia ficus-indica* (L.) Mill.), also produced, although on a smaller scale, is susceptible to infestation of *D. opuntiae.*^{21,22}

Several secondary metabolites are involved in the insect-plant interaction; identifying such compounds may help obtain cactus pear varieties resistant to pests through traditional breeding techniques and modern biotechnology. Thus, a quick way to distinguish the various metabolites of the same plant is to conduct a study of these plants' metabolomics. The variation in metabolites is observed mainly by analyzing the total changes in chromatographic patterns.²³⁻²⁶ The association of chromatography data with chemometric tools to treat multivariate data and pattern recognition, considering many chemical analysis results, helps to interpret and evaluate data effectively. Thus, the various metabolic data obtained using this approach allow the comparison between samples based on multivariate statistical methods, such as principal component analysis (PCA)²⁷ and orthogonal projections to latent structures discriminant analysis (OPLS-DA).28

This work aims to evaluate the use of ultra-performance liquid chromatography coupled with an electrospray ionization quadrupole time-of-flight mass spectrometry operating in MS^E mode (UPLC-QTOF-MS^E, E represents collision energy) to find biomarkers that can distinguish different species of Cactaceae, in addition to identifying secondary metabolites that confer resistance to *D. opuntiae*.

Experimental

Plant material

Samples of the species of *Nopalea cochenillifera* (L.) Salm-Dyck (IPA Sertânia), *Opuntia stricta* (Haw.) ("*palma orelha de elefante mexicana*"), and *Nopalea cochenillifera* ("*palma doce*") have been cultivated in the city of Trairi (CE, Brazil (3°16'40.0" S 39°16'08.0" W)). Sample collection was performed, so that, the respective species were studied in sample pool systems; in this study, a mixture of five clones *per* species (n = 5) was performed. The species *Opuntia ficus-indica* (L.) Mill. ("*palma gigante*", control), susceptible to attack by *Dactylopius opuntiae* (Hemiptera: Dactylopiidae), were provided by Empresa de Pesquisa Agropecuária do Rio Grande do Norte (EMPARN, Brazil).

Chemicals

The reagents used for this work's development were purchased from LiChrosolv[®] of the Sigma-Aldrich Chemical Company (St. Louis, MO, USA). The ultrapure water was obtained by the Milli-Q[®] water-purification system from Millipore (Billerica, MA, USA).

Sample preparation

Each plant material (200 g), was initially subjected to a bath with liquid N₂ for inactivation of the metabolism. Then, it was cut into cubes of 1 cm × 1 cm, lyophilized for four days, and ground in a knife mill. 10 g of the samples were extracted in biological triplicate in the accelerated solvent extraction (ASE) system from Thermo ScientificTM DionexTM ASETM 350 (Waltham, MA USA). They were previously homogenized in 5 g of diatomaceous earth, added to 66.0 mL cells, and extracted with 70:30 ethanol/ water (v/v) at the temperature of 80 °C, in 3 cycles of extraction with 10 min of duration. The resulting extracts were evaporated entirely under reduced pressure and lyophilized. The material was stored at -80 °C.

The second step in the extraction process was carried out by weighing 15 mg of each extract solubilized in 3.0 mL of a 90:10 (v/v) methanol/water solution, sonicated for 10 min, filtered on PTFE membrane 0.45 μ m. The resulting extract was subjected to solid-phase extraction using C18-E (55 μ m, 70 μ m) cartridges of 100.0 mg/3.0 mL for each sample. The cartridges were activated with 10.0 mL of methanol and conditioned with 10.0 mL of Milli-Q[®] H₂O. A volume of 3 mL of the samples was percolated in the cartridges. Cartridge cleaning was performed with 1.0 mL of Milli-Q H₂O. The sample was eluted with 3 mL of 90:10 methanol/water (v/v) solution. The eluate was collected and filtered on a 0.22 μ m PTFE (polytetrafluoroethylene) membrane. Subsequently, the volume of each eluate of interest was measured in a 5 mL volumetric flask with 90:10 (v/v) methanol/water solution, so that, all samples had the same concentration (1.5 mg mL⁻¹). After all the procedures were performed, the samples were injected into the system UPLC-QTOF-MS^E.

Chromatographic conditions

The chromatographic study was carried out in Acquity UPLC (Waters), coupled to a quadrupole time-of-flight (QTOF, Waters Corporation, Milford, MA, USA). The analyzes were performed on a column C18 Waters Acquity UPLC BEH (150 mm × 2.1 mm, 1.7 μ m), 40 °C, mobile phase: water with 0.1% formic acid (A) and acetonitrile with 0.1% formic acid (B), gradient varying 0-15 min (2-95%) B, (15.1-17) min (100%) of B, and (17.1-19.1) min (2%) B, 0.4 mL min⁻¹ flow and 5 μ L injection volume.

Mass spectrometry conditions

The electrospray ionization in negative mode (ESI⁻) was acquired in the range of 110-1180 Da, fixed source temperature at 120 °C, desolvation temperature 350 °C, the desalting gas flow of 500 L h⁻¹, 0.5 V extraction cone, 2.6 kV capillary voltage. At the low scan, the cone voltage was 35 V, collision energy of 5 eV (trap). The ESI⁺ mode was purchased in the range of 110-1180 Da, fixed source temperature at 120 °C, desolvation temperature 350 °C, the desalting gas flow of 500 L h⁻¹, 0.5 V extraction cone, voltage capillary of 3.2 kV. Leucine enkephalin was used as a lock mass. The MS mode used Xevo G2-XS QTOF. The spectrometer operated with MS^E centroid programming using a tension ramp from 20 to 40 V. The instrument was controlled by the MassLynx 4.1 program (Waters Corporation, Milford, MA, USA).

The samples were injected in triplicates in positive and negative ionization modes. A set of chromatograms and mass spectra were obtained for each of the four samples from the forage palm.

Identification of chemical compounds

The molecular formulas and the m/z values obtained from high-resolution spectra observed at the highest intensity chromatographic peaks were considered for the chemical identification. From each formula, the relative error in ppm was determined. Only molecular formulas with values below 10 ppm of error were considered for further MS/MS studies. The molecular structural proposals were carried out through MS/MS data, through the establishment of rational fragmentation patterns.²⁹⁻³³

A comparison of all chromatographic peaks was performed using a retention time tolerance deviation ± 0.05 min and an exact mass tolerance of ± 0.05 Da. For unidentified peaks, all possible molecular formulas were extracted (elements C, H, N, O, the tolerance of 10 ppm at least 2 carbon atoms) with the elemental composition tool of MassLynx.

Multivariate statistical analysis

Heat map analysis

The peaks area of the leading organic compounds identified in forage palm species were imported into GENE-E program³⁴ for pattern recognition using the hierarchical clustering analysis (HCA) model. The Euclidean distance method was used to measure the proximity between the samples (columns), and the results are visualized as a 2-D dendrogram (heat map): deeper red color represents the higher relative intensity; deeper blue color the lower relative intensity; and the intermediary intensity in white color.

Unsupervised evaluation by principal component analysis

The chromatograms were converted to American standard code for information interchange (ASCII) files to construct the numerical matrix. To reduce the original data dimensionality and observe composition trends under a 95% confidence level, the matrix was exported for chemometric evaluation by PCA using the software MatlabTM with the PLS Toolbox package.³⁵ Algorithms for baseline correction and normalization were applied over the variables (chromatograms), and the sample's data were mean-centered. The singular value decomposition (SVD) algorithm was used to decompose the matrix.

Supervised evaluation by orthogonal partial least squares discriminant analysis

The chromatograms were preprocessed using the software MarkerLynx XS 4.1 software program.³⁶ For data collection, the method's parameters were defined at a retention time interval of 0.50-8.0 min, a mass range of 110-1200 Da, a mass tolerance of 0.05 Da, and a noise elimination level set at 5. A generated list was made to identify the peaks detected using the retention time (t_R) and mass data (m/z). An arbitrary identification was assigned to each one of these pairs (t_R and m/z) based on the elution order of the UPLC system. The ions' identification was based on the t_R and m/z values compared with previously published data regarding the genus, the family, and species (chemotaxonomic approach) with the aid of databases ChemSpider³⁷ and PubChem.³⁸ The

ion intensities for each detected peak were normalized against the sum of the sample's peak intensities using MarkerLynx.³⁶ The ions of different samples were considered the same when combined with their t_R and m/z values. Therefore, the orthogonal projections to OPLS-DA were developed to corroborate the marker compounds for susceptible and non-susceptible species to attack by *D. opuntiae.*³⁹

Results and Discussion

Metabolite annotation by UPLC-QTOF-MSE

The samples were analyzed UPLC-QTOF-MS^E in ESI⁺ and ESI⁻ ionization modes. In general, the two ionization modes are mainly used to corroborate the compounds present in the extracts, aiding in identifying the molecules through positive and negative ionization. However, it was possible to observe that some peaks do not appear in the two ionization modes.

Figure 1 illustrates a comparison among the chromatograms plotted in the same intensity from each forage palm species. The peaks in chromatograms have a spectrum of masses to be analyzed. Therefore, the MS and MS/MS spectra were acquired, and the fragmentation study of the molecules in the extracts was performed. Table 1 describes the chemical compounds annotated in the respective extracts from four forage palm species. Also, the fragmentation of higher intensity and references that corroborate these metabolites identifications are presented. It is essential to highlight that 28 compounds were detected in the species profiling established through the MS^E spectra; through the dereplication, 18 compounds were annotated according to data previously published to the chemotaxonomy.

Peak 1 (2.13 min) showed a precursor ion $[M + H]^+$ at m/z 166.0869 (C₉H₁₁NO₂), which was assigned to a compound described in the literature, was annotated as

the amino acid phenylalanine. Wrona *et al.*⁴⁰ describe the fragment ion at m/z 120.0813, a specific fragment of phenylalanine, and the loss of the CHO₂ group. The same was detected in the positive injection mode.

Peak 2 (2.28 min), the ion was observed $[M - H]^-$ at m/z 255.0508 (C₁₁H₁₂O₇), being identified as piscidic acid. This molecule has been previously reported in *Opuntia*.⁴¹ The ion m/z 193.0504 was generated by the successive losses of H₂O and CO₂. The presence of piscidic acid in the samples was also confirmed by the analysis in the positive ionization mode, with fragments similar to those in the negative mode, adding the ion m/z 144.0447.

Compound **3** (2.50 min) is an unidentified molecule, $[M - H]^-$ at m/z 447.1132 ($C_{18}H_{24}O_{13}$), and not cited in any reference consulted. However, this molecule has fragmentations characteristic of the isorhamnetin group, m/z 315.0822. The fragment ion at m/z 152.0092 may be the group directly attached to isorhamnetin, so that, the compound may be a derivative of isorhamnetin. The compound was not detected in ESI⁺.

Compound 4 (2.75 min) was annotated as the amino acid tryptophan, $[M + H]^+$ at m/z 205.0976 ($C_{11}H_{12}N_2O_2$). Fragments originating in the MS/MS are cataloged by Wrona *et al.*⁴⁰ as specific tryptophan fragments. Compound 5 (2.98 min) is also an unidentified molecule, $[M - H]^-$ at m/z 959.3202 ($C_{46}H_{56}O_{22}$); however, it was detected by Semedo.⁴¹ The molecule did not respond in positive ionization mode, and its fragmentation shows that it is probably a derivative of kaempferol due to fragment m/z 285.0390. The fragment ion at m/z 813.2678 is due to the loss of a rhamnoside, which has a mass of 146 Da.⁴¹

Compound 6 (3.21 min) was annotated as eucomic acid. The fragment that gave rise to the signal m/z 179.0379 shows the loss of an acetic acid group of the eucomic acid molecule, a loss of 60 Da about precursor ion $[M - H]^-$ at m/z 239.0562



Figure 1. Chromatograms of samples of forage palm species (negative mode): (a) *Opuntia ficus-indica* (L.) Mill., (b) *Opuntia stricta* (Haw.), (c) *Nopalea cochenillifera* (L.) Salm-Dyck, and (d) *Nopalea cochenillifera*.

 $(C_{11}H_{12}O_6)$. The molecule does not respond to the positive ionization mode and has already been reported in *Opuntia*.^{9,42}

Compounds 7 (3.40 min), 13 (3.92 min), 17 (4.37 min), 21 (5.06 min), 22 (5.60 min), 25 (6.75 min), 26 (6.92 min), and 28 (7.42 min), Table 1, were not identified and had no reference in the literature consulted.

Compounds 8 (3.45 min), 11 (3.81 min), and 15 (4.26 min) are isomers that have the precursor ion $[M - H]^-$ at m/z 785.2136 (C₃₄H₄₂O₂₁) and similar products ions. Thus, compounds 8 and 11 were annotated as isorhamnetin-3-*O*-rutinoside-7-*O*-glucoside and isorhamnetin-

3-*O*-rudnoside-4'-*O*-glucoside. The fragmentation pattern showed the loss of hexose forming the ion at m/z 623.1558 $[M - H - 162]^-$, also was observed the ion at m/z 639.1594 $[M - H - 146]^-$ from the loss of deoxyhexose. The ion m/z 315.0447 $[M - H - 162 - 146 - 162]^-$ is ascribable to the aglycone mass, resulting from the loss of two hexose units and one unit of deoxyhexose.^{43,44} Compound **15** was annotated as isorhamnetin-3-sophoroside-7-rhamnoside due to fragment ion at m/z 459.1037 $[M - H - 146 - 180]^-$. The loss of 180 Da corresponding to the loss of the terminal glucosyl of a sophorosyl moiety.⁴⁵

Table 1. Metabolite annotation in samples in positive and negative ionization modes

Peak image IM - HI IM + HI IM + HI IM SMMS Error / Image Monetability Monetability <th rowspan="2">Peak</th> <th rowspan="2">t_R / min</th> <th colspan="4">Negative ion mode</th> <th colspan="4">Positive ion mode</th> <th>N 1 1</th> <th></th> <th></th>	Peak	t _R / min	Negative ion mode				Positive ion mode				N 1 1		
$ \begin{array}{ c c c c c c c c c c c c c c c c c c c$			[M – H] ⁻ observed	[M – H] [−] calculated	MS/MS	Error / ppm	[M + H] ⁺ observed	[M + H] ⁺ calculated	MS/MS	Error / ppm	formula	Metabolite annotation	Reference
2 2.82 255.050 255.05	1	2.13	-	-	_	_	166.0869	166.0868	120.0813	0.6	$C_9H_{11}NO_2$	phenylalanine	40
3 2.50 447.1132 477.113 155.0022 152.0022 -1.6 - - - C H C C H C C H C C H C C H C C H C C H C C H C C C C C C C C C C H C <thc< th=""> <thc< th=""> <thc< th=""></thc<></thc<></thc<>	2	2.28	255.0508	255.0505	193.0504; 165.0513	1.2	257.0655	257.0661	193.0510; 144.0447	-2.3	$C_{11}H_{12}O_7$	piscidic acid	41
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$	3	2.50	447.1132	447.1139	315.0822; 152.0092	-1.6	-	-	-	-	$C_{18}H_{24}O_{13}$	ni	-
5 2.98 959.3202 959.3185 813.2578; 285.0379; 179.0379; 179.0379; 179.0379; 259.0593 1.8 - - - Cu/HuO; Cu/HuO; ni - 6 3.21 239.0552 239.0556 179.0379; 179.0379; 189.0531 2.5 - - - Cu/HuO; euconic acid 46 7 3.40 533.148 253.148 259.0593 1.9 - - - Cu/HuO; isorhammetin- isorhammetin-3-0-ruinoside of 0-ruinoside-10-glucoside 43.44 9 3.45 - - - 479.1200 479.1190 317.0628 2.1 Cu/HuO; isorhammetin-bxoside 1 42 10 3.71 755.2035 310.0315 0.0 757.2191 757.2191 30.30504 0.4 Cu/HuO; isorhammetin-bxoside 1 42 11 3.81 785.2140 785.2149 639.1594; 315.0482 0.0 75 - - - Cu/HuO; isorhammetin-bxoside 1 30.44 12 3.85 71.197 71.198 609.1472; 315.0447 - - - Cu/HuO; isorhammetin-bxosid	4	2.75	_	-	-	-	205.0976	205.0977	188.0723; 146.0608 143.0740	-0.5	$C_{11}H_{12}N_2O_2$	tryptophan	40
6 3.21 239.0556 239.0556 179.0379; 129.0579 2.5 - - - C ₁ ,H ₁ ,O ₆ eucomic acid 46 7 3.40 533.1458 533.1448 250.0593 19 - - - C ₂ ,H ₄ O ₁₀ ni - 8 3.45 785.2136 785.2146 632.158; 315.0509 5 - - - C ₂ ,H ₄ O ₂₁ isorhammetin- isorhammetin-3-O-rutinoside - 4'-O-glucoside or isorhammetin-3-O-rutinoside - 4'-O-glucoside 142 30.0504 0.4 C ₃ ,H ₄₀ O ₂₁ isorhammetin- isorhammetin-3-O-rutinoside - 4'-O-glucoside or isorhammetin-3-O-rutinoside - 4'-O-glucoside or isorhammetin-3-O-rutinoside - 1'O-glucoside 0 3.4 11 3.81 785.2146 785.2140 639.1594; 623.1570; 310.0302 0.8 - - - C ₃ ,H ₄₀ O ₂₁ isorhammetin- isorhammetin- 3O-rutinoside - 3O-glucoside 0 - - - C ₃ ,H ₄₀ O ₂₁ isorhammetin- isorhammetin- 3O-rutinoside - 3O-glucoside 43.44 12 3.85 71.1977 71.1984 690.1472; 315.0480 -0.5 - - - C ₃ ,H ₄₀ O ₂₁ isorhammetin- sorhammetin-sorhomoside - 3O-glucoside 48 13	5	2.98	959.3202	959.3185	813.2678; 285.0390	1.8	-	-	-	-	$C_{46}H_{56}O_{22}$	ni	-
7 3.40 533.1458 50.075 757.2191 303.0504 0.4 7.340.021 634.420.21	6	3.21	239.0562	239.0556	179.0379; 149.0596	2.5	-	-	-	-	$C_{11}H_{12}O_6$	eucomic acid	46
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$	7	3.40	533.1458	533.1448	405.2111; 259.0593	1.9	-	-	-	-	$C_{29}H_{26}O_{10}$	ni	-
9 3.45 - - - 479.1200 479.1190 317.0628 2.1 $C_{23}H_{20}O_{12}$ isorhannetin hexoside I 42 10 3.71 755.2035 755.2035 301.0315 0.0 757.2191 757.2191 303.0504 0.4 $C_{23}H_{20}O_{12}$ isorhannetin hexoside I 47 11 3.81 785.2140 785.2140 623.1570; 315.0482 0.8 - - - C ₃₃ H ₄ O ₂₃ quercetin 3-0-2''.6''- 47.0-2 12 3.85 771.1977 771.1984 609.1472; 301.0302 -0.9 - - - C ₃₃ H ₆ O ₂₁ quercetin rhannosyl dincoside 4''-0-glucoside 48 13 3.92 931.2621 931.2626 417.1549; 315.0480 -0.0 771.2348 757.2249; 317.0620 66 C ₃₄ H ₄₂ O ₂₁ sorhannetin-sucosyl-din- rhannoside 49 15 4.26 785.2111 785.2140 451.0473 3.7 - - - C ₂₄ H ₄₂ O ₂₁ isorhannetin-sorhoroside- 7-thannoside 50 16 4.33 609.1466 609.1456 315.0474 3.7 -	8	3.45	785.2136	785.2140	623.1558; 315.0509	-0.5	-	_	_	_	$C_{34}H_{42}O_{21}$	isorhamnetin- 3-O-rutinoside-7-O-glucoside or isorhamnetin-3-O-rutinoside- 4'-O-glucoside	43,44
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$	9	3.45	-	-	-	-	479.1200	479.1190	317.0628	2.1	$C_{22}H_{22}O_{12}$	isorhamnetin hexoside I	42
113.81785.2140 $639.1594;$ $623.1570;$ $315.0482 C_{x}H_{z}O_{z}1000000000000000000000000000000000000$	10	3.71	755.2035	755.2035	301.0315	0.0	757.2194	757.2191	303.0504	0.4	$C_{33}H_{40}O_{20}$	quercetin-3- <i>O</i> -2",6"- dirhamnosylglucoside	47
12 3.85 771.1977 771.1984 $609.1472; \\ 301.0302$ -0.5 $ C_{33}H_{40}O_{31}$ quercetin rhamnosyl dihexoside 48 13 3.92 931.2621 931.2626 315.0480 -0.5 $ C_{39}H_{40}O_{31}$ quercetin rhamnosyl dihexoside 49 14 4.04 769.2183 769.2191 315.0480 -1.0 771.2399 771.2348 $757.2249; \\ 317.0620$ 6.6 $C_{34}H_{42}O_{21}$ sorhamnetin-glucosyl-di-hamnoside 49 15 4.26 785.2111 785.2140 $459.1037; \\ 315.04747 \\ 300.0242$ 3.7 $ -$	11	3.81	785.2146	785.2140	639.1594; 623.1570; 315.0482	0.8	-	-	-	_	$C_{34}H_{42}O_{21}$	Isorhamnetin- 3-O-rutinoside-7-O-glucoside or isorhamnetin-3-O- rutinoside- 4'-O-glucoside	43,44
13 3.92 931.2621 931.2626 $\frac{417.1549}{315.0480}$ -0.5 $ -$ </td <td>12</td> <td>3.85</td> <td>771.1977</td> <td>771.1984</td> <td>609.1472; 301.0302</td> <td>-0.9</td> <td>-</td> <td>-</td> <td>-</td> <td>_</td> <td>$C_{33}H_{40}O_{21}$</td> <td>quercetin rhamnosyl dihexoside</td> <td>48</td>	12	3.85	771.1977	771.1984	609.1472; 301.0302	-0.9	-	-	-	_	$C_{33}H_{40}O_{21}$	quercetin rhamnosyl dihexoside	48
144.04769.2183769.2191315.0480-1.0771.2399771.2348757.2249; 317.06206.6 $C_{34}H_{42}O_{20}$ isorhamnetin-glucosyl-di- rhamnoside49154.26785.2111785.2140 $\frac{623.1735;}{315.0447}$ 3.7 $C_{34}H_{42}O_{21}$ isorhamnetin-3-sophoroside- 7-rhamnoside50164.33609.1466609.1456315.04511.6C $_{27}H_{30}O_{16}$ isorhamnetin-pentosyl-glucoside49174.37647.1675ni-184.60623.1629623.1612 $\frac{315.0414;}{300.0242}$ 2.7625.1769 $\frac{317.0620;}{302.0424}$ 4.0 $C_{28}H_{32}O_{16}$ isorhamnetin-3-O-hexoside I51204.80477.1005477.1033 $\frac{314.0411;}{299.0217}$ -5.9ni-215.06nini-235.75801.2231801.2242315.0482-1.4ni-235.75603.2938nini-246.32315.0513315.055 $\frac{300.0272;}{271.0228}$ 2.5317.0663317.0661 $\frac{302.0424;}{274.0480}$ 0.6 $C_{16}H_{12}O_7$ isorhamnetin-3-O-hexoside II51246.32315.0513315.0555 $$	13	3.92	931.2621	931.2626	417.1549; 315.0480	-0.5	-	-	-	-	$C_{29}H_{56}O_{33}$	ni	-
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$	14	4.04	769.2183	769.2191	315.0480	-1.0	771.2399	771.2348	757.2249; 317.0620	6.6	$C_{34}H_{42}O_{20}$	isorhamnetin-glucosyl-di- rhamnoside	49
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$	15	4.26	785.2111	785.2140	623.1735; 459.1037; 315.0447	3.7					$C_{34}H_{42}O_{21}$	isorhamnetin-3-sophoroside- 7-rhamnoside	50
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$	16	4.33	609.1466	609.1456	315.0451	1.6	-	-	-	-	$C_{27}H_{30}O_{16}$	isorhamnetin-pentosyl-glucoside	49
18 4.60 623.1612 $315.0474; 300.0242$ 2.7 625.1794 625.1769 $317.0620; 302.0424$ 4.0 $C_{28}H_{32}O_{16}$ isorhammetin-3-D-mannosyi hexoside 48 19 4.74 477.1017 477.1033 $315.0474; 299.0164$ -3.4 479.1227 479.1190 $317.0626; 287.0539$ 7.7 $C_{22}H_{22}O_{12}$ isorhammetin-3- <i>O</i> -hexoside I 51 20 4.80 477.1005 477.1033 $314.0411; 299.0217$ -5.9 $C_{22}H_{22}O_{12}$ isorhamnetin-3- <i>O</i> -hexoside II 51 21 5.06 - - - 512.2746 - - - ni - 23 5.75 801.2231 801.2242 315.0482 -1.4 - - - C_{38}H_{42}O_{19} isorhamnetin-3- <i>O</i> -triglucoside 52 24 6.32 315.0513 315.0505 $300.0272; 271.0228$ 2.5 317.0663 317.0661 $302.0424; 374.0480$ 0.6 $C_{16}H_{12}O_7$ isorhamnetin 42,53 25 6.75 603.2938 - - - - - ni<	17	4.37	-	-	-	-	647.1675	-	-	-	-	ni izzatementin 2. Ostementeri	-
194.74477.1017477.1033 ${}^{315.04/4;}_{299.0164}$ -3.4479.1227479.1190 ${}^{317.0646;}_{287.0539}$ 7.7 $C_{22}H_{22}O_{12}$ isorhamnetin-3-O-hexoside I51204.80477.1005477.1033 ${}^{314.0411;}_{299.0217}$ -5.9 $C_{22}H_{22}O_{12}$ isorhamnetin-3-O-hexoside II51215.06ni-225.60526.2972ni-235.75801.2231801.2242315.0482-1.4C $_{38}H_{42}O_{19}$ isorhamnetin-3-O-triglucoside52246.32315.0513315.0505 ${}^{200.0272;}_{271.0228}$ 2.5317.0663317.0661 ${}^{302.0424;}_{274.0480}$ 0.6 $C_{16}H_{12}O_7$ isorhamnetin42,53256.75603.2938ni-266.92533.2997ni-277.13285.0387285.0399 ${}^{255.0292;}_{227.0335}$ -4.2287.0566 ${}^{257.0501;}_{229.0490}$ -5.6 $C_{15}H_{10}O_6$ kaempferol42,53287.42ni-287.42ni-287.42 <td< td=""><td>18</td><td>4.60</td><td>623.1629</td><td>623.1612</td><td>315.0414; 300.0242</td><td>2.7</td><td>625.1794</td><td>625.1769</td><td>317.0620; 302.0424</td><td>4.0</td><td>$C_{28}H_{32}O_{16}$</td><td>hexoside</td><td>48</td></td<>	18	4.60	623.1629	623.1612	315.0414; 300.0242	2.7	625.1794	625.1769	317.0620; 302.0424	4.0	$C_{28}H_{32}O_{16}$	hexoside	48
20 4.80 477.1005 477.1033 ${}^{314.0411}_{299.0217}$ -5.9 $C_{22}H_{22}O_{12}$ isorhamnetin-3-O-hexoside II 51 21 5.06 - - - 512.2746 - - - ni - 22 5.60 - - - 526.2972 - - - ni - 23 5.75 801.2231 801.2242 315.0482 -1.4 - - - C ₃₈ H ₄₂ O ₁₉ isorhamnetin-3-O-triglucoside 52 24 6.32 315.0513 315.0505 ${}^{200.0272}_{271.0228}$ 2.5 317.0663 317.0661 ${}^{302.0424}_{274.0480}$ 0.6 $C_{16}H_{12}O_7$ isorhamnetin 42,53 25 6.75 603.2938 - - - - - ni - 26 6.92 533.2997 - - - - - ni - 27 7.13 285.0387 285.0399 ${}^{250.2527}_{227.0335}$ -4.2 287.0566 ${}^{257.0501}_{229.0490}$ -5.6 $C_{15}H_{10}O_6$	19	4.74	477.1017	477.1033	315.0474; 299.0164	-3.4	479.1227	479.1190	317.0646; 287.0539	7.7	$C_{22}H_{22}O_{12}$	isorhamnetin-3-O-hexoside I	51
$\begin{array}{cccccccccccccccccccccccccccccccccccc$	20	4.80	477.1005	477.1033	314.0411; 299.0217	-5.9					$C_{22}H_{22}O_{12}$	isorhamnetin-3-O-hexoside II	51
$\begin{array}{cccccccccccccccccccccccccccccccccccc$	21	5.06	-	-	-	-	512.2746	-	-	-	-	ni	-
$\begin{array}{cccccccccccccccccccccccccccccccccccc$	22	5.60	-	-	-	-	526.2972	-	-	-	- с ч о	ni isorhampatin 2 O trighucosida	- 52
$\begin{array}{cccccccccccccccccccccccccccccccccccc$	23 24	6.32	315.0513	315.0505	313.0482 300.0272;	-1.4 2.5	- 317.0663	- 317.0661	- 302.0424; 274.0480	- 0.6	$C_{38}H_{42}O_{19}$ $C_{16}H_{12}O_{7}$	isorhamnetin	42,53
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$	25	6.75	603,2938	_	-	_	605 3230	_	27 4.04 00 -	_	_	ni	_
27 7.13 285.0387 285.0399 $\frac{255.0292}{227.0335}$ -4.2 287.0540 287.0566 $\frac{257.0501}{229.0490}$ -5.6 C ₁₅ H ₁₀ O ₆ kaempferol 42,53 28 7.42 573.2527	26	6.92	533.2997	-	_	_	-	_	_	-	_	ni	_
28 7.42 573.2527 ni -	27	7.13	285.0387	285.0399	255.0292; 227.0335	-4.2	287.0540	287.0566	257.0501; 229.0490	-5.6	$C_{15}H_{10}O_{6}$	kaempferol	42,53
	28	7.42	-	-	-	_	573.2527	-	-	-	-	ni	-

t_R: retention time; MS: mass spectrometry; ni: not identified.

Peak 9 (3.45 min) was annotated as isorhamnetin hexoside I, $[M + H]^+$ at m/z 479.1200 ($C_{22}H_{22}O_{12}$). The fragment m/z 317.0628 is due to the hexoside unit loss (162 Da), leaving the only isorhamnetin. The compound was not detected in a negative mode.⁴²

Compound **10** (3.71 min), was annotated as quercetin-3-*O*-2",6"-dirhamnosylglucoside, was observed in both ionization modes, $[M - H]^-$ at m/z 755.2035 and $[M + H]^+$ at m/z 757.2194 (C₃₃H₄₀O₂₀). The fragment ions were observed m/z 301.0315 and 303.0504, in negative and positive modes, respectively; the formation of these ions are attributed to the successive losses of two rhamnosyl units and a glucoside unit.⁴⁷

Compound **12** (3.85 min) was annotated as quercetinrhamnosyl-dihexoside, $[M - H]^-$ at m/z 771.1977, which has characteristic fragmentation of quercetin derivatives, m/z 609.1472 $[M - H - 162]^-$, resulting from the loss of a hexose, besides, also the ion is observed m/z 301.0302 $[M - H - 162 - 146]^-$ resulting from the successive losses of two units of hexose and one unit of rhamnoside.⁴⁸

Compound **14** (4.04 min) was annotated as isorhamnetin glucosyl-di-rhamnoside, $[M - H]^-$ at m/z 769.2183 and $[M + H]^+$ at m/z 771.2399 ($C_{34}H_{42}O_{20}$). The precursor ion $[M - H]^-$, originated the product fragment ion at m/z 315.0480 characteristic of isorhamnetin aglycone, revealing the loss of 454 Da correspondent to two rhamnoside units (2 × 146 Da) and a hexoside unit (162 Da).⁴⁹

Compound **16** (4.33 min) was annotated as isorhamnetin pentosyl-glucoside, $[M - H]^-$ at m/z 609.1442 ($C_{27}H_{30}O_{16}$). The fragment ion is formed from the losses of a hexose (162 Da) and a pentosyl (132 Da), leaving the aglycone, m/z 315.0451 [M – H – 162 – 132]⁻. This compound was previously determined in *Opuntia* spp.⁴⁹

Compound **18** (4.60 min) was annotated as isorhamnetin-3-*O*-rhamnosyl hexoside, $[M - H]^-$ at m/z 623.1629 (C₂₈H₃₂O₁₆). The fragment m/z 300.0242 is due to the loss of the two sugar units (162 Da of hexoside + 146 Da of the rhamnoside) and the isorhamnetin conversion to quercetin loss of a methyl group.⁴⁸

Compounds **19** (4.74 min) and **20** (4.80 min) showed ions $[M - H]^-$ at m/z 477.1017 and 477.1005 ($C_{22}H_{22}O_{12}$), respectively. The compounds were annotated as isorhamnetin-3-*O*-hexoside isomers, both of which have been described by Brito *et al.*⁵¹ The characteristic fragment ion around 315.0474 Da indicates the presence of isorhamnetin.

Compound **23** (5.75 min) showed precursor ion $[M-H]^$ at m/z 801.2231 (C₃₈H₄₂O₁₉) was previously reported in the literature,⁵² as isorhamnetin-3-*O*-triglucoside. The characteristic ion fragment at m/z 315.0482 was caused by the loss of the three glycoses attached to the isorhamnetin molecule (3 \times 162 Da). The same was not detected in positive mode.

Compound **27** (7.13 min), was annotated as kaempferol, $[M - H]^-$ at m/z 285.0387 and $[M + H]^+$ at m/z 287.0540 (C₁₅H₁₀O₆). The ion products m/z 227.0335 and m/z 255.0292 are characteristic of kaempferol, according to literature.^{42,53}

Multivariate analyses

Different chemometric approaches such as HCA, PCA, and OPLS-DA were performed from collected data to obtain an overview and understand the composition variability among the forage palm species. Initially, HCA's agglomerative method was applied, and all similarities among the forage palm species (biological triplicate) are shown in Figure 2 as a 2D dendrogram in heat map form. According to the columns, three separation tendencies may be visualized. O. stricta was the most different forage palms species from the others by the higher amounts of the compound at 2.13 min (phenylalanine), 3.21 min (eucomic acid), 3.45 min (isorhamnetin hexoside I), 3.85 min (quercetin rhamnosyl dihexoside), and 4.26 min (isorhamnetin-3-sophoroside-7-rhamnoside). Besides, O. ficus-indica is the susceptible species separated from the others by the higher amounts of piscidic acid (2.28 min), isorhamnetin-3-O-rutinoside-7-O-glucoside (3.81 min), isorhamnetin-pentosyl-glucoside (4.33 min), isorhamnetin-3-O-rhamnosyl hexoside



Figure 2. Dendrogram representing the chemical composition similarity relationship among the species of forage palm.

(4.60 min), isorhamnetin-3-*O*-hexoside I (4.74 min), isorhamnetin-3-*O*-hexoside II (4.80 min), isorhamnetin (6.32 min), and kaempferol (7.13 min).

Figure 3 illustrates the PCA results from the evaluation of different forage palms species by the scores (Figure 3a), influence plot (Figure 3b), and loadings (Figure 3c) with 95.99% of the total variance. The PC1 axis presented relevant information for forage palm separation according to the genus *Opuntia* and *Nopalea*. In general, both Nopalea species at positive scores showed higher amounts of the compounds quercetin-3-O-2',6'-dirhamnosylglucoside (10), isorhamnetinglucosyl-di rhamnoside (14), isorhamnetin-3-O-rhamnosyl hexoside (18), and isorhamnetin-3-O-triglucoside (23). On the other hand, both Opuntia species presented higher amounts of isorhamnetin-3-sophoroside-7-rhamnoside (15), mainly the forage palm species O. stricta (Haw). Also, the PC2 axis was essential to differentiate the Opuntia species by the higher amounts of quercetin-3-O-2',6'-dirhamnosylglucoside (10), isorhamnetin-3-sophoroside-7-rhamnoside (15), and isorhamnetin-3-O-triglucoside (23) in O. stricta (Haw) at negative scores, as well as the higher amounts of piscidic acid (2), isorhamnetin-glucosyl-di-rhamnoside (14), isorhamnetinpentosyl-glucoside (16), isorhamnetin-3-O-rhamnosyl hexoside (18), isorhamnetin-3-O-hexoside I (19), isorhamnetin-3-O-hexoside II (20), isorhamnetin (24), and kaempferol (27) in *O. ficus-indica* (L.) at positive scores. The influence biplot, according to Hotelling $T^2 \times Q$ -residuals, clearly showed the absence of samples negatively influencing the modeling (outliers at both values above 1, upper left quadrant).

To corroborate the biomarker compounds for discrimination of the susceptible (O. ficus-indica (L.) Mill.) and non-susceptible forage palm species (O. stricta (Haw.), *N. cochenillifera* (L.) Salm-Dvck, and *Nopalea cochenillifera*). OPLS-DA modeling associated with S-Plot analysis was applied separately for each binary classification as susceptible/non-susceptible species (Figure 4). Therefore, three classification analyses were performed, which showed a clear separation between the two groups (susceptible and non-susceptible) by the highlighted chromatogram peaks (described in Table 1) on S-Plot. To verify the quality of the resulting OPLS-DA model, two parameters were used: Q^2 (predicted variance) and the predicted model of the variables and R²Y (variance explained), which is the degree of explanation that the model possesses under the data presented. The results of R²Y (99%) and Q² (99%) indicating the good quality of the model.

The S-Plot is a scatter plot that illustrates the magnitude of each variable's correlation in the data set with the samples in the OPLS-DA, where each point represents an ion (pair t_R -m/z). Signals (peaks) with low magnitude (P₁) and low correlation (P_{corr1}) are close to the noise level



Figure 3. PCA results: (a) scores of the forage palm samples, (b) influence plot by Hotelling $T^2 \times Q$ residuals with 95% confidence limit, (c) respective loadings plotted in lines form: *Opuntia ficus-indica* (L.) Mill. in black, *Nopalea cochenillifera* in blue, *Opuntia stricta* (Haw.) in green, and *Nopalea cochenillifera* (L.) Salm-Dyck in red.



Figure 4. Relationship of the secondary metabolites with resistance to *D. opuntiae* by binary classification using OPLS-DA (left) and the S-Plot (right) with the peaks number: (a) *Opuntia ficus-indica* (L.) Mill. × *Opuntia stricta* (Haw.), (b) *Opuntia ficus-indica* (L.) Mill. × *Nopalea cochenillifera* (L.) Salm-Dyck, and (c) *Opuntia ficus-indica* (L.) Mill. × *Nopalea cochenillifera*.

if they are closer to zero. The ideal markers present high magnitude (P_1) and high correlation (P_{corr1}), with the signals that appear farthest from zero.⁵⁴

In this context, it is possible to infer by S-Plots that the peaks 10, 12, 13, and 15, (Table 1), respectively correspondent to the secondary metabolites quercetin-3-*O*-2',6'-dirhamnosylglucoside, quercetin rhamnosyl dihexoside, not identified, isorhamnetin-glucosyldi-rhamnoside and isorhamnetin-3-sophoroside-7-rhamnoside, which may be strongly associated with non-susceptible forage palm species explored in this work.

It was important to note that among the studied species, N. cochenillifera, N. cochenillifera (L.) Salm-Dyck, and O. stricta (Haw.) are resistant to carmine cochineal (*Dactylopius opuntiae*). On the other hand, the species O. ficus-indica (L.) Mill. is the only one susceptible. Therefore, these possible biomarkers associated with non-susceptible species may be correlated with resistance to cochineal carmine action in defense of the plant. These compounds are more prominent in species resistant to the pest (Figures 2 and 4). However, there may be other compounds associated with resistance, but they were not identified in the present study due to limitations in the techniques used.

Among the secondary metabolites, flavonoids are among the most common and widespread groups of defense compounds, which play an essential role in the host plant's resistance against herbivorous insects.⁵⁵⁻⁵⁸ Thus, the flavonoids identified in the present study may be associated with the resistance of forage palm species to carmine cochineal.

Many flavonoids can act as deterrents for phytophagous insects, even at relatively low concentrations,^{59,60} besides acting as digestibility reducers, repellents, and toxic to insects.⁶¹⁻⁶⁴ In studies with larvae of *Trichoplusia ni* and *Anticarsia gemmatalis* (fed with soy leaves *Glycine max* Merrill) demonstrated that the presence of flavonoids rutin and quercetin-3-glucosyl glucoside, in combination with genistein, acted synergistically by making it difficult to consume and accumulate food in the larvae. High concentrations of these compounds are present in soybean genotypes resistant to Lepidoptera-plague. Thus, flavonoids can be used in breeding programs as a source of resistance against defoliant insects, including the development of resistant cultivars expressing specific flavonoids.^{59,65}

In maize plants, the most likely defense substances are flavonoids, the presence of *C*-glycosyl flavone, maysin (2"-O- α -L-rhamnosyl-6-C-(6-deoxy-xylo-hexos-4-ulosyl) luteolin), provides resistance to *Helicoverpa zea*, and is generally more abundant in genotypes resistant to this pest. With high amounts of these compounds, transgenic maize showed more excellent resistance to corn earworms, which presented lower weight and higher mortality due to the compounds' deterrent effect.⁶⁶

Other authors have also observed the negative effects of flavonoids on the performance of phytophagous insects. In an experiment performed with canola (Brassica napus L.), it was observed that phenolic compounds including isorhamnetin-3-sophoroside-7-glucoside and kaempferol-3,7-diglucoside promoted the reduction of larval weight and the development time of larvae and pupae of Mamestra configurata (Walk.); thus acting as food detergent and prolonging the feeding time of this species-pest.⁶⁷ This phenomenon was also observed, studying biological aspects of Helicoverpa armigera and Spodoptera frugiperda, fed with added rutin diets, observed an inhibitory effect on the feeding behavior of these species, providing prolongation and delay in development.68,69 For sucking insects, it was found that the cultivar of soybean, with a higher concentration of flavonoids, caused a higher mortality rate of Bemisia tabaci biotype B. Also, the rutin content increases during the development of the plant, coinciding with the reduction in the survival of the nymphs of B. tabaci. Thus, flavonoids are probably related to the defense of soy to chewing and sucking insects. The effects of naringenin and quercetin (two polyphenolic flavonoids) are recognized to play an essential role in defending the plant against other sucking insects.⁷⁰ In the literature, some reports demonstrated the adverse effects of naringenin on the behavior of the Acyrthosiphon pisum.⁷¹

The results showed that further studies are needed to determine the mechanisms of action of these biomarkers, mostly flavonoids, found in *Nopalea cochenillifera* (L.) Salm-Dyck, *Opuntia stricta* (Haw.), and *Nopalea cochenillifera*. The study is the basis for implementing methods based on advanced phenotyping, using target analyzes to select pest-resistant materials, thus increasing the plant's defense power.

Conclusions

The present study compared the chemical profile of four forage palm species, in which the only one is susceptible to cochineal carmine and the other resistant ones. In total, 28 metabolites were detected in the forage palm species, of which 18 were annotated. The derivatives of isorhamnetin, quercetin, and kaempferol stand out as the forage palm's main components, presenting great variety and intensity in the samples.

PCA provided good separation of the four forage palm species, thus indicating a distinction between them. It was also possible to identify the compounds responsible for the difference between forage palm species. The OPLS-DA and S-Plot analyzes pointed out the biomarkers that are possibly responsible for conferring resistance to forage palm species on carmine cochineal quercetin-3-*O*-2',6'dirhamnosylglucoside, quercetin rhamnosyl dihexoside, and isorhamnetin-3-sophoroside-7-rhamnoside

This work provided knowledge of the metabolic basis of no susceptibility in forage palm, which until then was not known, allowing future research to explore and establish a relationship between chemical composition and resistance of the host to the insect-plague.

In summary, this study allows determining the knowledge of the metabolic base of the studied species. Besides, it was possible to establish a relationship between species' biomarkers not susceptible to cochineal carmine.

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Author Contributions

Thiago K.B. Matos was responsible for conceptualization, data curation, investigation and writing original draft; Jhonyson A. C. Guedes for conceptualization, data curation, investigation, software, validation, visualization, writing original draft, writing-review and editing; Elenilson G. Alves Filho for software, validation and writing original draft; Licia R. Luz for validation, visualization and writing original draft; Gisele S. Lopes for conceptualization, resources, validation, visualization, writing-review and editing; Ronaldo F. Nascimento for conceptualization, visualization, writing-review and editing; João A. Sousa for conceptualization, data curation, investigation and resources; Kirley M. Canuto for conceptualization, validation, visualization, writing-review and editing; Edy S. Brito for conceptualization, formal analysis funding acquisition, validation, visualization, writing-review and editing; Nivia S. Dias-Pini for conceptualization, validation, visualization, writing original draft, writing-review and editing; Guilherme J. Zocolo for conceptualization, formal analysis funding acquisition, investigation, project administration, resources, validation, visualization, writing original draft, writing-review and editing.

References

- 1. Han, H.; Felker, P.; J. Arid Environ. 1997, 36, 133.
- Aguirre, J. J.; de La Garza, H. T.; Xugasti, A. C.; Belmares, R. C.; Aguilar, N. C.; *Asian Pac. J. Trop. Biomed.* 2013, *3*, 436.
- Bezerra, B. G.; Araújo, J. S.; Pereira, D. D.; Laurentino, G. Q.; Silva, L. L.; *Rev. Bras. Eng. Agric. Ambient.* 2014, 18, 755.
- Reyes-Aguero, J. A.; Aguirre, R. J. R.; Valiente-Banuet, A.; J. Arid Environ. 2006, 64, 549.
- 5. Cai, W.; Gu, X.; Tang, J.; Czech J. Food Sci. 2010, 28, 108.
- Yahia, E. M.; Mondragon-Jacobo, C.; *Food Res. Int.* 2011, 44, 2311.
- Bayar, N.; Kriaa, M.; Kammoun, R.; *Int. J. Biol. Macromol.* 2016, 92, 441.
- Pinheiro, K. M.; da Silva, T. G. F.; Carvalho, H. F. S.; Santos, J. E. O.; de Morais, J. E. F.; Zolnier, S.; dos Santos, D. C.; *Pesq. Agropec. Bras.* 2014, 49, 939.
- Ginestra, G.; Parker, M. L.; Bennett, R. N.; Robertson, J.; Mandalari, G.; Narbad, A.; Lo Curto, R. B.; Bisignano, G.; Faulds, C. B.; Waldron, K. W.; *J. Agric. Food Chem.* 2009, *57*, 10323.
- Stintzing, F. C.; Carle, R.; *Mol. Nutr. Food Res.* 2005, 49, 175.
- Al-shahib, W.; Marshall, R. J.; *Int. J. Food Sci. Nutr.* 2003, 54, 247.
- Ribeiro, E. M. O.; da Silva, N. H.; de Lima Filho, J. L.; de Brito, J. Z.; da Silva, M. P. C.; *Cienc. Tecnol. Aliment.* **2010**, *30*, 933.
- Lee, E. H.; Kim, H. J.; Song, Y. S.; Jin, C.; Lee, K.-T.; Cho, J.; Lee, Y. S.; Arch. Pharm. Res. 2003, 26, 1018.
- Santos-Zea, L.; Gutiérrez-Uribe, J. A.; Serna-Saldivar, S. O.; J. Agric. Food Chem. 2011, 59, 7054.
- Feugang, J. M.; Konarski, P.; Zou, D.; Stintzing, F. C.; Zou, C.; Front. Biosci. 2006, 11, 2574.
- Ventura-Aguilar, R. I.; Bosquez-Molina, E.; Bautista-Baños, S.; Rivera-Cabrera, F.; J. Sci. Food Agric. 2017, 97, 5065.
- Flores-Hernández, A.; Murillo-Amador, B.; Rueda-Puente, E. O.; Salazar-Torres, J. C.; García-Hernández, J. L.; Troyo-Diéguez, E.; *Rev. Mex. Biodivers.* 2006, *77*, 97.
- Lopes, E. B.; Palma Forrageira: Cultivo, Uso Atual e Perspectivas de Utilização no Semi-árido Nordestino, 1st ed.; EMEPA/FAEPA: João Pessoa, Brazil, 2007.
- dos Santos, D. C.; Farias, I.; Lira, M. A.; dos Santos, M. V. F.; de Arruda, G. P.; Coelho, R. S. B.; Dias, F. M.; de Melo, J. N.; *Manejo e Utilização da Palma Forrageira (Opuntia e Nopalea) em Pernambuco*; Empresa Pernambucana de Pesquisa Agropecuária (Instituto Agronômico de Pernambuco): Recife, Brazil, 2006.
- Smith, C. M.; Clement, S. L.; Annu. Rev. Entomol. 2012, 57, 309.
- 21. de Vasconcelos, A. G. V.; Lira, M. A.; Cavalcanti, V. L. B.;

dos Santos, M. V. F.; Willadino, L.; *Rev. Bras. Zootec.* 2009, 38, 827.

- Borges, L. R.; Santos, D. C.; Cavalcanti, V. A. L. B.; Gomes, E. W. F.; Falcão, H. M.; da Silva, D. M. P.; *Acta Hortic.* 2013, 359.
- Mao, Q.; Bai, M.; Xu, J.; Kong, M.; Zhu, L.; Zhu, H.; Wang, Q.; Li, S.; J. Pharm. Biomed. Anal. 2014, 97, 129.
- 24. Fukusaki, E.; Kobayashi, A.; J. Biosci. Bioeng. 2005, 100, 347.
- Sumner, L. W.; Mendes, P.; Dixon, R. A.; *Phytochemistry* 2003, 62, 817.
- 26. Krastanov, A.; Biotechnol. Biotechnol. Equip. 2010, 24, 1537.
- 27. Nyamundanda, G.; Brennan, L.; Gormley, I.; *BMC Bioinf.* 2010, *11*, 571.
- 28. Worley, B.; Powers, R.; Curr. Metabolomics 2013, 1, 92.
- Bouslimani, A.; Sanchez, L. M.; Gargb, N.; Dorrestein, P. C.; Nat. Prod. Rep. 2014, 31, 718.
- 30. Kind, T.; Fiehn, O.; BMC Bioinf. 2007, 8, 105.
- 31. Kind, T.; Fiehn, O.; Bioanal. Rev. 2010, 2, 23.
- Moco, S.; Bino, R. J.; De Vos, R. C. H.; Vervoort, J.; *TrAC*, *Trends Anal. Chem.* 2007, 26, 855.
- Yuliana, N. D.; Jahangir, M.; Verpoorte, R.; Choi, Y. H.; *Phytochem. Rev.* 2013, *12*, 293.
- GENE-E, https://software.broadinstitute.org/GENE-E/index. html, accessed in April 2021.
- 35. *Matlab™ with the PLS Toolbox package*, version R2020a; Eigenvector Research Inc., Wenatchee, WA, USA, 2020.
- MarkerLynx XS, version 4.1 SCN719; Waters Corporation, Milford, USA, 2009.
- 37. ChemSpider: Search and share Chemistry, http://www. chemspider.com/, accessed in April 2021.
- PubChem, https://pubchem.ncbi.nlm.nih.gov/, accessed in April 2021.
- Nsuala, B. N.; Kamatou, G. P.; Sandasi, M.; Enslin, G.; Viljoen, A.; *Biochem. Syst. Ecol.* 2017, 70, 155.
- Wrona, M.; Pezo, D.; Canellas, E.; Nerín, C.; J. Chromatogr. A 2016, 1432, 73.
- Semedo, A. C. J.; Compostos Bioativos de Opuntia ficus indica; Universidade de Lisboa: Lisboa, 2012.
- Abu-Reidah, I. M.; Ali-shtayeh, M. S.; Jamous, R. M.; Arráez-Román, D.; Segura-carretero, A.; *Food Chem.* 2015, 166, 179.
- Aquino, R.; Behar, I.; D'agostino, M.; De. Simone, F.; Schettino,
 O.; Pizza, C.; *Biochem. Syst. Ecol.* **1987**, *15*, 667.
- Saleem, M.; Kim, H. J.; Han, C. K.; Jin, C.; Lee, Y. S.; *Phytochemistry* 2006, 67, 1390.
- Goupy, P.; Vian, M. A.; Chemat, F.; Caris-Veyrat, C.; *Ind. Crops* Prod. 2013, 44, 496.
- Astello-García, M. G.; Cervantes, I.; Nair, V.; Santos-Díaz, M. S.; Reyes-Agüero, A.; Guéraud, F.; Negre-Salvayre, A.; Rossignol, M.; Cisneros-Zevallos, L.; Barba de la Rosa, A. P.; *J. Food Compos. Anal.* 2015, 43, 119.

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- Guo, L.; Dou, L.-L.; Duan, L.; Liu, K.; Bi, Z.-M.; Li, P.; Liu, E.-H.; *Chin. J. Nat. Med.* **2015**, *13*, 711.
- Farag, M. A.; Mohsen, M.; Heinke, R.; Wessjohann, L. A.; Food Res. Int. 2014, 64, 218.
- Mata, A.; Ferreira, J. P.; Semedo, C.; Serra, T.; Duarte, C. M. M.; Bronze, M. R.; *Food Chem.* 2016, *210*, 558.
- Ferreres, F.; Taveira, M.; Pereira, D. M.; Valentão, P.; Andrade, P. B.; *J. Agric. Food Chem.* **2010**, *58*, 2854.
- Brito, A.; Ramirez, J. E.; Areche, C.; Sepúlveda, B.; Simirgiotis, M. J.; *Molecules* 2014, *19*, 17400.
- Schmidt, S.; Zietz, M.; Schreiner, M.; Rohn, S.; Kroh, L. W.; Krumbein, A.; *Rapid Commun. Mass Spectrom.* 2010, 24, 2009.
- Son, J.; Lee, B. H.; Nam, T. G.; Im, S.; Chung, D. K.; Lee, J. M.; Chun, O. K.; Kim, D.-O.; *J. Food Biochem.* 2014, *38*, 518.
- 54. Guedes, J. A. C.; Santiago, Y. G.; dos Reis Luz, L.; Silva, M. F. S.; Ramires, C. M. C.; de Lima, M. A. C.; de Oliveira, V. R.; do Ó Pessoa, C.; Canuto, K. M.; de Brito, E. S.; Lima, M. F.; Alves, R. E.; Zampieri, D.; do Nascimento, R. F.; Zocolo, G. J.; *Phytochem. Lett.* **2020**, *40*, 26.
- 55. Cornell, H. V.; Hawkins, B. A.; Am. Nat. 2003, 161, 507.
- 56. Ferreyra, M. L. F.; Rius, S. P.; Casati, P.; *Front. Plant Sci.* **2012**, *3*, 1.
- War, A. R.; Paulraj, M. G.; Ahmad, T.; Buhroo, A. A.; Hussain, B.; Ignacimuthu, S.; Sharma, H. C.; *Plant Signal. Behav.* 2012, 7, 1306.
- 58. Treutter, D.; Environ. Chem. Lett. 2006, 4, 147.
- Hoffmann-Campo, C. B.; Harborne, J. B.; McCaffery, A. R.; *Entomol. Exp. Appl.* **2001**, *98*, 181.

- Harborne, J. B.; Grayer, R.; *The Flavonoids, Advances in Research Since 1986: Flavonoids and Insects*; Chapman and Hall: London, 1994.
- Green, P. W. C.; Stevenson, P. C.; Simmonds, M. S. J.; Sharma, H. C.; *J. Chem. Ecol.* 2003, 29, 811.
- 62. Simmonds, M. S. J.; Phytochemistry 2003, 64, 21.
- 63. Iwashina, T.; Biol. Sci. Space 2003, 17, 24.
- Renwick, J. A. A.; Zhang, W.; Haribal, M.; Attygalle, A. B.; Lopez, K. D.; *J. Chem. Ecol.* 2001, 27, 1575.
- Hoffmann-Campo, C. B.; Ramos Neto, J. A.; de Oliveira, M. C. N.; Oliveira, L. J.; *Pesq. Agropec. Bras.* 2006, *41*, 1453.
- Johnson, E. T.; Berhow, M. A.; Dowd, P. F.; J. Agric. Food Chem. 2007, 55, 2998.
- Onyilagha, J. C.; Lazorko, J.; Gruber, M. Y.; Soroka, J. J.; Erlandson, M. A.; *J. Chem. Ecol.* 2004, *30*, 109.
- Jadhav, D. R.; Mallikarjuna, N.; Rathore, A.; Pokle, D.; *Asian J. Agric. Sci.* 2012, *4*, 298.
- Silva, T. R. F. B.; Almeida, A. C. D. S.; Moura, T. D. L.; da Silva,
 A. R.; Freitas, S. D. S.; Jesus, F. G.; *Acta Sci. Agron.* 2016, *38*, 165.
- Vieira, S. S.; Lourenção, A. L.; da Graça, J. P.; Janegitz, T.; Salvador, M. C.; de Oliveira, M. C. N.; Hoffmann-Campo, C. B.; Arthropod-Plant Interact. 2016, 10, 525.
- Goławska, S.; Sprawka, I.; Łukasik, I.; Goławski, A.; J. Pest Sci. 2014, 87, 173.

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