Molecular signatures associated with prostate cancer cell line (PC-3) exposure to inactivated Zika virus

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The recent outbreak of Zika virus (ZIKV) infection associated with microcephaly cases has elicited much research on the mechanisms involved in ZIKV-host cell interactions. It has been described that Zika virus impairs cell growth, raising a hypothesis about its oncolytic potential against cancer cells. ZIKV tumor cell growth inhibition was later confirmed for glioblastoma. It was also demonstrated that an inactivated ZIKV prototype (ZVp) based on bacterial outer membrane vesicles has antiproliferative activity upon other cancer cell lines, such as PC-3 prostate cancer cell. This study aims at understanding the pathways that might be involved with the antiproliferative effect of Zika virus against prostate cancer cells. A metabolomic approach based on high-resolution mass spectrometry analysis led to the identification of 21 statistically relevant markers of PC-3 cells treated with ZVp. The markers were associated with metabolic alterations that trigger lipid remodeling, endoplasmic reticulum stress, inflammatory mediators, as well as disrupted porphyrin and folate metabolism. These findings highlight molecular signatures of ZVp-induced response that may be involved on cellular pathways triggered by its antiproliferative effect. To our knowledge, this is the first reported metabolomic assessment of ZIKV effect on prostate cancer cells, a promising topic for further research.

The recent outbreak of Zika virus infection associated with microcephaly cases on South and Central America emerged the need for understanding the mechanisms involved in ZIKV-host cell interaction. It was observed that the tropism of ZIKV to neuronal cells leads to consequent impairment of stem cells differentiation, neuronal growth, cellular cycle arrest, and cell death. Zika virus-mediated cell death has also been associated with increased expression of pro-apoptotic and autophagic pathways such as dysregulation on PI3K-Akt pathway and caspase-3. As other flaviviruses, ZIKV uses host cell enzymatic machinery and orchestrate a reorganization of lipid metabolism to promote viral replication and processing of its own proteins. ZIKV is composed of three structural proteins (capsid (C), precursor membrane (prM), and envelope protein (E)) and seven nonstructural proteins (NS1, NS2A, NS2B, NS3, NS4A, NS4B e NS5). Among these, NS4A and NS4B were reported as key elements involved in growth restriction through Akt/mTOR stress-response pathway, since their interactions with Akt and mTOR inactivation lead to autophagy. Markers related to impaired Akt/mTOR signaling have been associated with ZIKV-host interaction and was identified in the serum of infected patients, in a new proposed approach for Zika diagnosis.

In addition to neural tissue, the confirmation of ZIKV transmission through sexual contact suggested viral tropism to reproductive tract cells. Kumar et al. (2018) demonstrated that Sertoli cells are susceptible to ZIKV, and replication is persistent in the male reproductive tract. Moreover, ZIKV was able to infect testis of mice, leading to an important increase in Reactive Oxygen Species (ROS) and consequently to testicular oxidative stress and impaired spermatogenesis. In addition, men infected with ZIKV presented prostatitis and hemospermia.

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sustaining prostate infection and inflammation. Human prostate epithelial adenocarcinoma (LNCaP) has also shown permissiveness to infection and ZIKV replication, thus confirming cellular tropism to prostate malignant cells. All this data, therefore, suggest human prostate as a ZIKV reservoir on sexual transmission through semen.

Given the ZIKV tropism to various cell types, and its ability of interrupting cell growth, a hypothesis was raised about its oncolytic potential. In vitro and in vivo experiments were conducted to confirm the antiproliferative activity of Zika against glioblastoma tumor cells. Zhu et al. (2017) demonstrated that ZIKV preferentially targets glioblastoma stem cells, differently from another neurotropic flavivirus, the West Nile Virus, WNV, which kills both normal and tumor cells. Due to potential virus virulence latency on CNS, Dabaja et al. (2018) evaluated metabolic alterations in glioblastoma cells induced by a ZIKV prototype (ZVp), which also demonstrated cytopathic effects. This prototype based on inactivated ZIKV particles fused with Outer Membrane Vesicles (OMV) from Neisseria meningitidis demonstrated significant immune response and great potential for tumor management. Additionally to the cytopathic effect demonstrated in glioblastoma cells, ZVp has also shown tropism and antiproliferative effects against the PC-3 androgen-independent human prostate cancer cell line, whose mechanisms are yet to be elucidated.

Prostate cancer etiology, progression and therapy responsiveness have been associated with oxidative stress, DNA instability and aberrant DNA methylation. Defense mechanisms against ROS are used as a survival strategy by tumor cells. However, increased ROS, ER stress, cell cycle arrest and DNA damage are also strategies used in anticancer therapy through approaches such as radiotherapy and chemotherapy. One study demonstrated that PC-3 and DU-145 cells differed significantly in their radiosensitivity due to variations in basal and induced Nrf2 (Nuclear Factor Erythroid 2-Related Factor-2) expression levels. This basic leucine zipper transcription factor modulates cell inflammatory and immune response by inducing the transcription of antioxidant enzymes, which have a role in maintenance of cancer cell survival and disease progression. However, despite indications of Nrf2 overexpression in malignant cells, several authors demonstrated evidences that cytoprotective enzymes are downregulated in prostate cancer, partially due to hypermethylation of CpG sites in the Nrf2 gene;


**Results**

In order to evaluate the metabolic alterations upon inactivated Zika virus exposure, we treated the PC-3 human prostate cancer androgen-independent cell line with ZVp. After 24 hours of incubation, the cellular extracts of non-exposed and exposed cells were directly infused in a high-resolution mass spectrometer for data analysis on positive and negative ion modes. The acquired mass spectra data were submitted to multivariate statistical analysis (PLS-DA) for group comparison. PLS-DA is a supervised regression analysis, widely used in metabolomics to assess association among sample groups. The principle is based on linear combinations of data variables and further extraction from mass spectrometry raw data features that discriminate sample clustering. Results disposed in Fig. 1 showed remarkable separation between cells exposed to ZVp treatment versus non-exposed cells on both positive and negative ionization modes. The statistical separation among groups confirms the existence of discriminative analytes associated with ZVp-induced metabolic cell alterations. The model was statistically significant on both ion modes (p < 0.001) through validation with prediction accuracy during training permutation test (see Additional File, Fig. S1).

Based on variable importance in projection (VIP) score values greater or equal to 2.2, molecules that metabolically discriminated Group 2 from Group 1 were elected. A heat map analysis (See Additional File, Fig. S2) demonstrated the distribution of the most relevant markers among samples. On the positive ion mode, we were able to identify 10 biomarkers for the ZVp-treated condition, while 11 biomarkers were elucidated on the negative ion mode. Characterization was performed cross-checking data from high-resolution mass spectrometry, statistically discriminant biomarkers for PC-3 treated ZVp were selected and structurally proposed as an attempt to correlate the antiproliferative effect reported in the literature with molecular signatures.

It was possible to correlate biomarkers’ function with the recent finds on the antiproliferative effect of Zika virus on prostate cancer cell. Some molecules, identified on Table 1, are involved in cell mechanisms impaired during viral exposure, while others suggest altered pathways that might lead to prostate cancer cell death. Among them, we found changes on the lipidomic cell profile of phospholipids and ceramides, inflammatory mediators, N-glycan biosynthesis precursors, porphyrin and folate, whose importance is briefly illustrated in Figs 2 and 3. Supported by literature information, we were able to infer the significance of these molecules on PC-3 prostate cancer cell line metabolism disrupted by viral influence and the role of ZIKV interactions with metabolic pathways of host cells.

**Discussion**

Viral replication is a mechanism closely dependent on host cell factors. To achieve this purpose, flaviviruses, including ZIKV, promote a reorganization of lipid metabolism and the endoplasmic reticulum (ER) membrane to favor replication. ZIKV, particularly, promotes alterations on general lipid metabolism. In this context, although the proposed ZVp is a particle with inactivated ZIKV, i.e. there is no actual infection and/or replication,
key active or binding moieties from molecules that trigger certain pathways may remain intact, even after thermal inactivation; therefore, some lipid classes may play fundamental roles in the interaction with viral antigens and express mediators of cellular response upon contact with ZVp.

Ceramide phosphate (32:1) \( m/z \) 590.4555 and Glucosylceramide (30:1) \( m/z \) 644.5105 were identified as chemical markers for the ZVp-exposed condition. Increased basal levels of ceramides are known to have effects over cell fate regulation, and are also associated with cell stress conditions. During infection of pathogenic flaviviruses (e.g. Dengue Virus (DENV) and WNV), increased ceramide levels have been reported, especially due to their role on viral assembly by membrane vesiculation. Arboleda et al. (2009) highlighted the potential of increased ceramide levels to induce mitochondrial dysfunction and neuronal cells death through autophagy mediated by the PI3K/Akt pathway (See Fig. 2). Thus, the induction of increased levels of ceramides has been used as an anticancer strategy, given its ability to promote the activation of cancer cell death through apoptosis and autophagic responses.

Other lipids elected by our analysis play an important structural role on cell membranes. Phosphatidylethanolamines (PE), Phosphatidylserines (PS), Phosphatidylinositol (PI), Phosphatidylcholine (PC), Phosphatidic acid (PA) and Phosphatidylglycerol (PG) are abundant lipids on cellular membranes, and therefore are on front of cell-cell and cell-pathogen interactions. Statistically relevant metabolic markers for PC-3 cells exposed to ZVp condition were identified as five PEs with \( m/z \) 658.5186 PE(P-32:0), \( m/z \) 678.4872 PE(P-34:4), \( m/z \) 688.5292 PE-NMe(32:0), \( m/z \) 702.5445 PE(P-32:1) and \( m/z \) 766.5394 PE(38:5) on positive ion mode. Being a product of PS decarboxylation, both PE and PS play roles on ZIKV facilitating viral entry on normal conditions. Furthermore, the increase of intracellular PE positively regulates autophagy in mammalian cells. Autophagic membranes are enriched in PE, and this molecule also participates as an anchor to LC3 autophagic protein. Hamel et al. (2015) demonstrated the expressed co-localization of ZIKV viral envelope and cytosolic LC3, suggesting the role of this protein on a ZIKV-induced autophagic process. Thus, the lipidation of LC3 to promote autophagosome membrane formation is a process dependent on PE abundance, suggesting that the excess of PE may contribute to ZIKV-mediated cell death.

Different anionic phospholipids [\( m/z \) 499.2609 PA(20:1), \( m/z \) 477.1662 PG(12:0), \( m/z \) 455.2421 PG(14:0) and \( m/z \) 515.2274 PI(12:0)] were also elected by the statistical model. Anionic lipids such as PA and lysoPA favor membrane curvature by the action of flipases, and this rearrangement may promote better interaction of membrane phospholipids with flavivirus’ molecules. Phosphatidylinositols in particular had their association with ZIKV previously reported in metabolomic studies, corroborating to our findings. When evaluating the cytopathic impact of inactivated ZIKV on glioblastoma cells, Dabaja et al. (2018) observed PI and phosphatidylinositol phosphate (PIP) as biomarkers. In addition, Melo et al. (2017) reported several alterations on PIP and PIP2 metabolites in the serum of patients infected with ZIKV strain, which suggests that the interaction with ZVp may be sufficient to promote cell alterations. Phosphatidylinositol phosphates are important precursors in PI3K/Akt pathway, which leads to mTORC1 inhibition of autophagic processes and cell survival. The upregulation of this pathway significantly contributes to prostate cancer cell proliferation, migration and invasion. Due to previously reported ZIKV NS4A and NS4B blockade of Akt signaling and the presence of PIs derivatives is expected, and may highlight the molecular signatures of an autophagic fate.

Cell death may also be triggered by caspase 3 activation in neuroprogenitor cells, a stimulus that may promote generation of platelet-activating factor (PAF) as counteraction for tumor cell repopulation. PAF, nonetheless, presents dual functions: (i) as a contributor to tumorigenesis, and (ii) as a promoter of cell death, participating...
**Table 1.** Proposed chemical markers elected by PLS-DA VIP scores ≥ 2.2 from PC-3 prostate cancer cells exposed to Zika virus prototype on both positive and negative ion mode. 1METLIN ID; aRepresentative ID for the class; bCarbon number: double bond; cNot specified-molecules with the same m/z and similar fragmentation profile. CerP-Ceramide phosphate; GlcCer-Glucosylceramide; PAF-Platelet activating factor; PC-Phosphatidylcholine; PE-Phosphatidylethanolamine; PI-Phosphatidylinositol; PG-Phosphatidylglycerol; HO-PGF – Hydroxy Prostaglandin F2α; HO-PGE – Hydroxy Prostaglandin E; PGH2-EA - Prostaglandin H2-Ethanolamine.

| Compound | Adduct | Experimental Mass | Theoretical Mass | Error (ppm) | ID1 | MSMS |
|----------|--------|-------------------|-----------------|-------------|-----|------|
| PGGH2-EA | [M + K]+ | 432.2505 | 432.2511 | 1.39 | 74984 | 415, 386, 372 |
| CerP(32:1)a | [M + H]+ | 590.4555 | 590.4544 | −1.86 | 103039 | 544, 309, 281, 573, 558, 232 |
| N-Acetyl-D-glucosaminyl diphosphooligosaccharide | [M + Na]+ | 610.2145 | 610.2153 | 1.31 | 6251 | 355, 266, 464, 371, 221, 284 |
| Azelaoyl PAE | [M + H – H2O]+ | 634.4436 | 634.4448 | 1.89 | 62938 | 573, 624, 587, 520 |
| GlcCer (30:1)b | [M + H]+ | 644.5105 | 644.5096 | −1.39 | 7222 | 612, 626, 598, 459, 532, 516 |
| PE-P(34:4)b | [M + H – H2O]+ | 658.5186 | 658.5176 | −1.52 | 62174b | 400, 627, 613, 459 |
| PE-NMe(32:0)b | [M + H – H2O]+ | 688.5299 | 688.5281 | −1.59 | 60733b | 511, 566, 431, 412, 342, 463, 656 |
| PE-P(32:1)c | [M + H]+ | 702.5445 | 702.5432 | −1.85 | 62178b | 648, 670, 656, 333, 459, 365, 644 |
| PE(P38:5)c | [M + H]+ | 766.5394 | 766.5381 | −1.70 | 60376b | 720, 706, 747, 734, 548, 569, 485 |

**Positive Ion Mode**

| Compound | Adduct | Experimental Mass | Theoretical Mass | Error (ppm) | ID1 | MSMS |
|----------|--------|-------------------|-----------------|-------------|-----|------|
| HO-PGFα, or HO-PGEα, ii | [M + Cl]- | 405.2042 | 405.2049 | 1.73 | 36117b or 36196b | 337, 369, 387, 367, 373, 361 |
| Dihomo-PGFα, or Dihomo- PGE, or Isoprostanes, ii | [M + Cl]- | 417.2408 | 417.2413 | 1.19 | 36206b or 36171b | 297, 373, 289, 399 |
| Dolichol phosphate D-mannose | [M – H]- | 425.1939 | 425.1946 | 1.64 | 5925 | 283, 367, 379, 255, 313, 407 |
| PG(14:0)α | [M – H]- | 455.2421 | 455.2415 | −1.31 | 80000b | 397, 423, 339, 437, 409, 387 |
| PG(12:0)α | [M – H]- | 477.1662 | 477.1661 | 1.87 | 4086b | 415, 459, 437, 417, 409, 441, 449 |
| PA(20:1)α | [M – H]- | 499.2606 | 499.2597 | −1.80 | 82345b | 383, 373, 311, 261, 431, 441, 481, 453, 463 |
| PI(12:0)α | [M – H]- | 515.2272 | 515.2263 | −1.75 | 81172 | 447, 397, 399, 401, 457, 478, 497 |
| 5-Methyltetrahydroproseroyl- tri-glutamate | [M – H+H2O – H]- | 621.2276 | 621.2269 | −1.13 | 3684 | 584, 505, 353, 563, 603, 612 |
| Isocoproorphyrin or Coproporphyrin (I, II, III or IV) α | [M – H+H2O – H]- | 635.2518 | 635.2506 | −1.89 | 5665b | 599, 577, 617 |
| Dehydroisocoproorphyrin | [M – H]- | 651.2471 | 651.2460 | −1.68 | 6570 | 571, 633, 615, 607, 593, 583 |
| Coproporphyrinogen (I or III) α | [M + Cl]- | 695.2863 | 695.2853 | −1.44 | 63930 or 80 | 653, 677, 665, 659, 637, 569 |
the cell engages a well-coordinated heme biosynthesis through heme negative feedback and a fine control of porphyrin derivatives by degradation enzymes and transporters. Heme oxygenase (HO-1) is a stress response enzyme, induced by Nrf2 signaling and inflammation, responsible to transform heme derivatives in biliverdin, carbon monoxide and ferrous iron. HO-1 exhibits antiviral activity against several flavivirus, such as DENV, Hepatitis C (HCV) and ZIKV. However, recently it was observed that ZIKV could limit HO-1 antiviral activity in a translational or post-translational manner, impairing HO-1 efficacy, a real possibility given the role of ZIKV on ER stress. Thus, the capacity of HO-1 modulation by ZIKV may implicate in viral persistence and alterations on heme metabolism. Moreover, a fundamental outer membrane transporter of porphyrin to mitochondria for heme synthesis is ABCB6, and its expression responds to intracellular porphyrin levels. The markers elucidate the spontaneous oxidation of Coproporphyrinogens to Coproporphyrin isomers. The presence of these autoxidation products may occur due to porphyrin precursor accumulation. We hypothesize that an impairment on heme degradation through HO-1 by ZIKV molecules may eventually increase mitochondrial concentrations of heme, causing negative feedback on ABCB6 importer, and consequently accumulation of porphyrin precursors. Excess of porphyrin may photosensitize cancer cells, triggering elevation of ROS and cell death. Since this is a complex and important system for cell homeostasis, further experiments need to be addressed to confirm the role of ZIKV on porphyrin metabolism of prostate cancer cells.

Regarding the autophagic process, cytoplasmic vacuolation and ER-derived autophagosome formation is an evidence of response to ZIKV particles. The previously discussed lipid remodeling induced by ZIKV, as well as the excess use of N-linked glycosylation enzymes for cancer cell protein glycosylation are factors that may trigger an ER stress response. N-acetyl-D-glucosaminyldiphosphodolichol m/z 610.2145 and Dolichol phosphate D-mannose m/z 425.1939, precursors of N-glycan biosynthesis, were identified as biomarkers of ZIKV interaction with autophagic pathway. These factors may contribute to trigger cellular stress and prostate cancer cell death. Abbreviations: AA – arachidonic acid; COX – cyclooxygenase; ER – Endoplasmic reticulum; OxPL – Oxidized phospholipids; PAF – Platelet Activating Factor; PAFR – PAF receptor; PE – Phosphatidylethanolamine; PI – Phosphatidylinositol; ROS – Reactive Oxygen Species.

**Figure 2.** Lipid metabolism alterations induced by ZIKV on prostate cancer cells (PC-3 line) mediate increased levels of: phosphatidylinositol, a marker of ZIKV interaction with autophagic pathway; ceramides, that contribute to autophagy; phosphatidylethanolamine, which assist on particle recognition and autophagosome formation; and phosphatidylcholine, which are markers of ZIKV interaction with autophagic pathway and mitophagy. Zika virus stresses prostate cancer cells leading to high levels of ROS and consequently the presence of oxidized molecules and inflammatory mediators. Together, all these factors may contribute to trigger cellular stress and prostate cancer cell death. Abbreviations: AA – arachidonic acid; COX – cyclooxygenase; ER – Endoplasmic reticulum; OxPL – Oxidized phospholipids; PAF – Platelet Activating Factor; PAFR – PAF receptor; PE – Phosphatidylethanolamine; PI – Phosphatidylinositol; ROS – Reactive Oxygen Species.
reported as an alternative chemotherapeutic strategy\(^5\). An OST inhibitor has been reported as a strategy to flavivirus infection blockage, suggesting that ZIKV molecules interact with host cell machinery\(^6,52\). In fact, ZIKV E protein glycosylation and infectivity is assisted by STT3A expression\(^52\). Therefore, considering these findings, an increase in N-glycan precursors may appear as a result of ZIKV and PC-3 cell interaction with either N-glycosylation machinery or ER stress. Thus, the interaction between ZIKV and N-glycosylation enzymes, in addition to ROS-mediated ER stress, may lead to the accumulation of misfolded protein and consequently ER function impairment and pro-apoptotic signaling\(^50\).

Figure 3. Proposed interaction of ZIKV moieties with pathways involved on (a) porphyrin homeostasis, (b) protein glycosylation process and (c) one-carbon metabolism, leading to the presence of elected biomarkers (in red). (a) Heme formation is dependent of an influx of porphyrins into mitochondria which is coordinated by the action of CPOX and UROD enzymes on porphyrin precursors. However, ZIKV interaction with HO-1 enzyme (1) may interfere on heme degradation process. Disturbances on heme metabolism eventually affect porphyrins mitochondrial transport through ABCB6 (2) resulting on porphyrin accumulation (3) represented by Cop (1 and II) and Dehydroisocoproporphyrin and its oxidation products (4) illustrated by Cop (I, II, III and IV) and Isocop; (b) ZIKV may interact with OST complex displayed on endoplasmic reticulum (ER) (1), which has an important role on the N-glycan translocation, impairing on host cell protein glycosylation (2). This interaction may lead to misfolded protein formation (3) and ER stress (4) contributing to N-glycan precursors accumulation (5); and (c) SAM is an essential methyl donor for methylation processes and its availability impact on the one carbon metabolism molecules abundance. Possible ZIKV NS5 moieties interference on SAM (1) and SAH (2) impact SAM availability and regulation of MTHFR (3), leading to 5-MTHF accumulation (4). As consequence, 5-MTHF negatively control GNMT activity (5), decreasing sarcosine production and promoting a better prognosis to prostate cancer cells. Abbreviations: Cop – Coproporphyrin; Copn – Coproporphyrinogen; Dehydroisocoproporphyrin; HarderoPn – Harderoporphyrinogen; Isocop – Isocoproporphyrinogen; Ppn – Protoporphyrinogen; Pp – Protoporphyrin; Uropn – Uroporphyrinogen; CPOX – Coproporphyrinogen Oxidase; UROD – Uroporphyrinogen Decarboxylase; PPOX – Protoporphyrinogen Oxidase; FECH – Ferrochelatase; HO-1 – Heme Oxygenase; OST – Oligosaccharyltransferase; GNMT – Glycine N-Methyltransferase; 5-MTHF – 5-Methyltetrahydrofolate; THF – Tetrahydrofolate; MTHFR – Methylenetetrahydrofolate Reductase; SAM – S-Adenosylmethionine; SAH – S-Adenosylhomocysteine; MT – Methyltransferase.

Moreover, some ZIKV non-structural proteins interact with host biomolecules on methylation steps\(^53,54\). The availability of methyl donors requires intracellular folate from a functional one-carbon metabolism\(^55\). 5-Methyltetrahydropteroyl tri-L-glutamate (5-MTHF) \(m/z\) 621.2276, a folate derivative, was found as a ZVP-treated biomarker; the same molecule was previously described by Dabaja et al. (2018) during glioblastoma antiproliferative assessment\(^56\), corroborating the importance of this finding. This molecule participates in the conversion of methionine to S-Adenosylmethionine (SAM), homocysteine to methionine, and as downregulation factor for Glycine N-Methyltransferase (GNMT)\(^55\). For instance, 5-MTHF formation is regulated by precursor availability and SAM levels, which in high levels exerts inhibitory effects on MTHF reductase\(^55\) (See Fig. 3). Coloma et al. (2016) reported that the non-structural protein NS5 has homology to methyltransferases and may sequestrate SAM as methyl donor\(^53\). Moreover, NS5 may bind to S-Adenosylhomocysteine (SAH) blocking the regeneration of homocysteine and consequently remethylation of methionine and SAM\(^54\). SAM is used in prostate cancer cells for glycine methylation into sarcosine via GNMT; high levels of sarcosine were found to be a biomarker of prostate cancer progression\(^56\). The inhibition of GNMT results in decreased sarcosine, diminished proliferation and a better prognosis of prostate cancer\(^56,57\). All these factors may implicate on modifications of
intracellular levels of SAM in one-carbon metabolism and, consequently, 5-MTHF accumulation. Furthermore, changes in DNA methylation of genes in developing cells and human neural cells suggest that one-carbon metabolism is a key pathway on microcephaly\cite{48,50}. Given the basal prostate cancer cell aberrant methylation and ZIKV interaction with folate metabolism, ZVp may interfere on DNA instability, thereby controlling cell fate.

All abovementioned biomarkers were proposed to be involved with the effects of Zika prototype on PC-3 prostate cancer cell line; remarkably, they pointed to ZVp-host lipid remodeling and interaction of ZIKV moieties with key pathways for cell homeostasis, namely the regulation of cytoprotective enzymes, autophagic signaling and ROS induced stress, raising new hypotheses about the role of ZIKV as an oncolytic virus and a promoter of male infertility. The metabolomics approach applied herein has allowed not only the observation of a handful of non-obvious biomarkers, but also their related pathways, which are being correlated to Zika for the first time. Our findings suggest, therefore, the involvement of several pathways with the antiproliferative effect of Zika virus against prostate cancer contributing to a promising topic for future research; this also reinforces the importance of studies with broader, untargeted metabolomics/lipidomics approaches, as most of these pathways might not have been identified by targeted biomolecular assays. Finally, to the best our knowledge, these molecular signatures were the first reported for prostate cancer cells exposed to inactivated ZIKV particles.

Methods

Zika virus prototype (ZVp) production. The Brazilian ZIKV strain (BeH823339, GenBank KU729217) was kindly provided by Professor Doctor Edison Durigon (Biomedical Sciences Institute, University of São Paulo). This strain was isolated from an infected patient in 2015 during the Zika outbreak in the State of Ceará (Brazil) and used for ZVp production. *N. meningitidis* (C2135), *Aedes albopictus* (C6/36) and glial cell (M059J) lines were obtained from INOQS—FIOCRUZ (National Institute for Quality Control—Oswaldo Cruz Foundation, Rio de Janeiro, RJ and Cell Bank).

Culture and infection of C6/36 cells with ZIKV strain was used to replicate the virus after cell confluence achieved 70%. C6/26 culture and infection followed the procedure reported by Melo et al.\cite{40}. After viral cytopathic effect (CPE) reached 75%, aliquots of 1 mL of ZIKV were stored at −80°C.

Intending to obtain Outer Membrane Vesicles (OMVs), *Neisseria meningitidis* was chosen as the microorganism to provide OMVs. For that, this bacterial species was grown at 37°C under 5% of CO₂ in agar GCB (Difco). *N. meningitidis* OMVs were isolated according to Alves et al.\cite{14} and stored in −80°C before use.

The product OMV fused Zika virus was obtained from M059J cell cultures. These cells were infected with ZIKV strain, then OMV particles were added and the culture were submitted to agitation, inducing ZIKV-OMV fusion. The supernatants containing OMV-ZIKV fused particle (ZVp) were formed, collected, inactivated at 56°C for 1 h and characterized for the parameters of size, polydispersity index (PDI), and electric charge potential using a Zetasizer Nano equipment (Malvern Instruments Ltd., Grovewood Road, Malvern, United Kingdom). In addition, a Nano Tracking Analysis (NanoSign Equipment, Malvern Instruments Ltd., Grovewood Road, Malvern, United Kingdom) was used to determine particles per frame and particles per mL (concentration). The tests performed for ZVp characterization and results is described by Martins et al. (2018) procedure\cite{49}.

PC-3 cell culture and ZVp test. PC-3 human prostate cancer cell line was gently provided by Frederick Cancer Research & Development Center, National Cancer Institute, Frederick, MA, USA. Cell cultures growth was performed accordingly to the procedure established by Roman Jr et al.\cite{62}. Briefly, 5 mL of RPMI-1640 supplemented with 5% of fetal bovine serum (RPMI/FBS 5% Gibco®, USA) and 1% penicillin: streptomycin (Nutricell®, Brazil, 1000 U/mL) at 37°C with 5%CO₂ was used for PC-3 cells grown until confluence of 80%. For the experiments, PC-3 cells were used between passages 5 to 12.

Tests using PC-3 cell line and Zika virus prototype (ZVp) were similar to those applied for Glioblastoma cells reported by Dabaja et al.\cite{60}. Briefly, PC-3 cells were transferred to 96-well plates (100 µL.well⁻¹), inoculation density: 4.5 × 10⁴ cell. mL⁻¹). To achieve statistical significance, 10 wells were used to culture the PC-3 cells for the control test, and 10 wells to culture PC-3 cells exposed to ZVP at a concentration of 5.9 × 10⁴ ZVP mL⁻¹ (diluted in cell medium) for 24 h at 37°C and 5% CO₂. The chosen ZVP concentration, condition, and time point were previously determined by GI₅₀ data (concentration for 50% of maximal inhibition of cell proliferation) obtained from an antiproliferative assay performed by Dabaja et al.\cite{60}. The control group was maintained at the same conditions, except by the exposure to ZVP aliquot.

Sample preparation. After trypsinization, 200 µL PC-3 prostate cancer cells exposed and non-exposed to ZVP were transferred to a 2 mL plastic tube and stored at −80°C until analysis. The sample preparation procedure was performed according to Melo et al.\cite{40}. Briefly, 20-µL aliquots of each sample were added to a plastic tube containing 200 µL of tetrahydrofuran and vortexed for 30 seconds at room temperature. After agitation, the extract was diluted with methanol (1000 µL.q.s.), homogenized and centrifuged at 3200 rpm for 5 minutes for protein precipitation. Subsequently, 20 µL of each supernatant was diluted in 980 µL of methanol and separated in two aliquots of 500 µL each and ionized separately with the addition of 0.1% formic acid (positive ion mode) and 0.1% ammonium hydroxide (negative ion mode) for HRMS analysis.

High resolution mass spectrometry analysis (HRMS). Each solution was directly infused in high resolution mass spectrometer ESI-LTQ-XL Orbitrap Discovery (Thermo Scientific, Bremen, Germany) with a nominal resolution of 30,000 (FWHM). Spectral data were acquired using the following parameters: flow rate of 10 µL.min⁻¹, capillary temperature at 280°C, 5 kV spray voltage and sheath gas at 10 arbitrary units. Each sample had 10 technical replicates acquired in the mass range of 400–1100 m/z and analyzed using XCalibur software (v. 2.4, Thermo Scientific, San Jose, CA).
Statistical analysis and structural proposals. To investigate the induced alterations of ZVp on PC-3 cell model a Partial Least Square Discriminant Analysis (PLS-DA) was performed using the online software MetaboAnalyst 4.0 (www.metaboanalyst.ca). A guided selection of molecules \( m/z \) is established by the observation of VIP (Variable Importance in Projection) scores, that transports the impact of selected features in the proposed model. Only biomarkers with VIP scores equal to, or greater than, 2.2 were evaluated. Prediction accuracy during training test with 2000 permutations was used to assess model significance on both ion modes. A VIP heat map of the selected markers using the Euclidean’s distance measurement and Ward’s clustering algorithm was built to illustrate the distribution of the most important biomarkers among groups.

The identity of statistically relevant markers were assessed through comparison of high resolution \( m/z \) marker (mass error < 2 ppm) with available metabolomic databases such as HMDB v 4.0 (Human Metabolome database—www.hmdb.ca), METLIN (Scripps Center for Metabolomics, La Jolla, CA) and Lipid MAPS (University of California, San Diego, CA—www.lipidmaps.org). Tandem MS experiments were used for confirmatory purpose, being acquired in the same instrument, using Helium as the collision gas, with energies for collision-induced dissociation (CID) ranging from 20–50 (arbitrary units). Spectra were compared with theoretical mass fragmentation of Mass Frontier software (v. 6.0, Thermo Scientific, San Jose, CA).

Data availability
The datasets used and/or analyzed during the current study are available from the corresponding author on reasonable request.

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Author contributions
M.L. was responsible for ZVp development. A.R., G.G., E.L. and M.D. conducted cellular culture, ZVp administration to PC-3 cells and sample collection. J.D., F.D.-A., K.M. and G.S. performed mass spectrometry analysis. J.D. performed data analysis and wrote the manuscript. E.L., F.D.-A., D.N.d.O., C.M., A.R. and R.C. contributed with data and manuscript review. R.C. idealized all experiments and managed the research group. All authors read and approve the final manuscript.

Competing interests
The authors declare no competing interests.

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