

Article

Not peer-reviewed version

# Intracellular Fate of the Photosensitizer Chlorin e4 with Different Carriers and Induced Metabolic Changes studied by $^1\text{H}$ NMR Spectroscopy

[Martina Vermathen](#)\*, Tobias Emmanuel Kämpfer, [Jean-Marc Nuoffer](#), [Peter Vermathen](#)\*

Posted Date: 25 August 2023

doi: 10.20944/preprints202308.1801.v1

Keywords: Photodynamic Therapy; Photosensitizer; Porphyrinic Compounds; Polymeric Carriers; Nanoparticles; Metabolic Profile; HR-MAS NMR; DOSY; PVP; Kolliphor



Preprints.org is a free multidiscipline platform providing preprint service that is dedicated to making early versions of research outputs permanently available and citable. Preprints posted at Preprints.org appear in Web of Science, Crossref, Google Scholar, Scilit, Europe PMC.

Copyright: This is an open access article distributed under the Creative Commons Attribution License which permits unrestricted use, distribution, and reproduction in any medium, provided the original work is properly cited.

## Article

# Intracellular Fate of the Photosensitizer Chlorin e4 with Different Carriers and Induced Metabolic Changes Studied by $^1\text{H}$ NMR Spectroscopy

Martina Vermathen <sup>1,\*</sup>, Tobias Kämpfer <sup>1,2</sup>, Jean-Marc Nuoffer <sup>3,4</sup> and Peter Vermathen <sup>2,5,6,\*</sup>

<sup>1</sup> Department of Chemistry, Biochemistry and Pharmaceutical Sciences, University of Bern, 3012 Bern, Switzerland; tobias.kaempfer@unibe.ch (T.K.)

<sup>2</sup> Department of BioMedical Research, University of Bern, 3008 Bern, Switzerland

<sup>3</sup> Institute of Clinical Chemistry, Bern University Hospital, Switzerland; Jean-Marc.Nuoffer@insel.ch (J.-M.N.)

<sup>4</sup> Department of Pediatric Endocrinology, Diabetology and Metabolism, University Children's Hospital of Bern, Switzerland

<sup>5</sup> University Institute of Diagnostic and Interventional Neuroradiology, Bern University Hospital, University of Bern, 3010 Bern, Switzerland

<sup>6</sup> Translational Imaging Center (TIC), Swiss Institute for Translational and Entrepreneurial Medicine, Bern, Switzerland

\* Correspondence: martina.vermathen@unibe.ch (M.V.); peter.vermathen@insel.ch (P.V.); Tel.: +41-(0)31-684-3948 (M.V.); +41-(0)31-632-3559 (P.V.).

**Abstract:** Porphyrinic photosensitizers (PSs) and their nano-sized polymer-based carrier systems are required to exhibit low dark toxicity, avoid side effects, and ensure high in vivo tolerability. Yet, little is known about the intracellular fate of PSs during the dark incubation period and how it is affected by nanoparticles. In a systematic study, high resolution magic angle spinning NMR spectroscopy combined with statistical analyses was used to study the metabolic profile of cultured HeLa cells treated with different concentrations of the PS chlorin e4 (Ce4) alone or encapsulated in carrier systems. For the latter, either polyvinylpyrrolidone (PVP) or the micelle forming polyethylene glycol (PEG)-polypropylene glycol triblock copolymer Kolliphor P188 (KP) were used. Diffusion edited spectra indicated Ce4 membrane localization evidenced by Ce4 concentration dependent chemical shift perturbation of the cellular phospholipid choline resonance. The effect was also visible in the presence of KP and PVP, but less pronounced. The appearance of the PEG resonance in the cell spectra pointed towards cell internalization of KP whereas no conclusion could be drawn for PVP that remained NMR-invisible. Multivariate statistical analyses of the cell spectra (PCA, PLS-DA and oPLS) revealed a concentration-dependent metabolic response upon exposure to Ce4 that was attenuated by KP and even more by PVP. Significant Ce4-concentration dependent alterations were mainly found for metabolites involved in the tricarboxylic acid cycle and the phosphatidylcholine metabolism. The data underline an important protective role of the polymeric carriers following cell internalization. Moreover, the current study allowed - to our knowledge for the first time - to trace the intracellular PS localization on an atomic level by NMR methods.

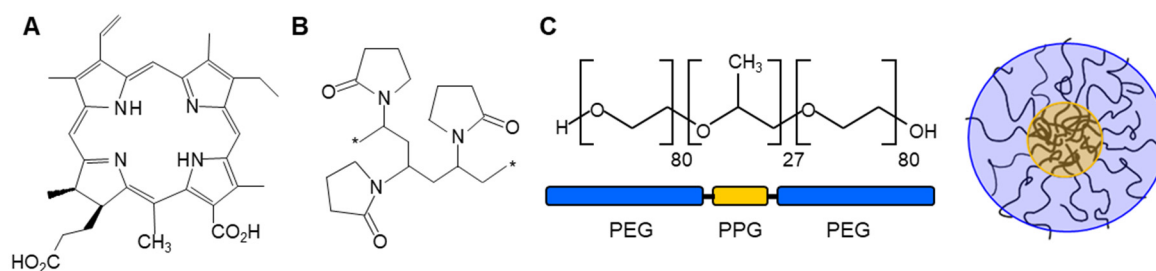
**Keywords:** photodynamic therapy; photosensitizer; porphyrinic compounds; polymeric carriers; nanoparticles; metabolic profile; HR-MAS NMR; DOSY; PVP; kolliphor

## 1. Introduction

The chlorophyll-based porphyrinic derivatives of chlorin e6 (Ce6) are efficient photosensitizers (PSs) in Photodynamic therapy (PDT) of cancer and non-cancerous diseases. PDT relies on the activation of the PS by light irradiation upon which the excited PS transfers energy to molecular oxygen that in turn leads to the formation of cytotoxic singlet oxygen and reactive oxygen species (ROS) in its immediate surrounding [1]. Among the favorable properties of Ce6 derivatives is their intense light absorption in the wavelength region of 600–700 nm [2,3] where tissue penetration of light is deeper than at shorter wavelengths [4]. Several Ce6 derivatives have received approval for

specific applications of cancer [2,5] and the sodium salt of chlorin e4 (Ce4, Figure 1A) has been recently patented for use in PDT of different cancers including ovarian cancer under the trademark Photosoft [6,7].

With the development of the so-called third generation PSs [5], the use of nano-platforms for drug delivery has become an essential part in PDT to improve PS efficiency [8]. Nanoparticle (NP) based carriers can improve the solubility and bioavailability of the often lipophilic and aggregating porphyrinic PSs [8]. Further, NP surface modifications like polyethylene glycol (PEG) can improve PS stability during the transport in the blood by reducing PS removal through macrophages or the reticuloendothelial system [9,10]. Based on their large size, NPs can accumulate in tumor tissue via the enhanced permeability and retention (EPR) effect of the tumor vasculature that is more permeable for macromolecules than normal tissue [11]. Finally, the NP surface offers possibilities for chemical modifications aiming at specific targeting [12]. Cell entry of NPs normally takes place via endocytic pathways where the specific route is determined by the cell type and by the nature of the NP [13]. Physicochemical properties of NPs like size, shape, chemical composition and surface charge not just determine cell uptake but also intracellular trafficking [13–16]. Among the various materials applied for nano-sized delivery systems, polyvinylpyrrolidone (PVP, Figure 1B) [17–19] and block copolymer micelles (BCMs, Figure 1C) [20–22] consisting of polymers with PEG and polypropylene glycol (PPG) blocks of different sizes and molecular weights (PEG-PPG-PEG, Pluronic) have gained much interest as carriers for PSs [8,23–27]. Recently, we have shown that Ce6-derived PSs including Ce4 are well encapsulated into PVP and into biodegradable BCMs formed by Kolliphor P188 (KP, Figure 1C) [28–31]. Both carriers stabilize the chlorin in aqueous solution by preventing aggregation and maintaining its photophysical properties and the uptake of Ce4 into HeLa cells could be proved by fluorescence microscopy [31].



**Figure 1.** (A) Structure of the photosensitizer chlorin e4 (Ce4); (B) Building block of the polymeric network formed by polyvinylpyrrolidone (PVP, MW<sub>av</sub> 10 kDa); (C) PEG-PPG-PEG triblock copolymer Kolliphor P 188 (KP) and a sketch of a KP-micelle.

Both, the PS (Ce4) and the NP (PVP, KP) are biocompatible and have very low dark toxicity [17,20,31,32], which is required to avoid side effects while at the same time ensuring a controlled cytotoxic effect of the PS that is directed by light irradiation for localized therapy. Typically, the dark toxicity of PSs is assessed under exclusion of light by common cytotoxicity assays like the Alamar Blue [33,34] or MTT test (using a *methyl-thiazol-tetrazolium* dye) [34,35] that are based on the activity of cellular enzymes. However, the perturbation of the physiologic state of the cells, i.e., their metabolic response toward treatment with PSs in the dark has rarely been studied. Similarly, the role of the nano-sized polymeric PS-delivery system needs to be evaluated and better understood: How does the carrier affect the biocompatibility, overall cellular homeostasis and molecular processes triggered by the PS? How does the nature of the carrier modulate these processes? In vitro model studies using cultured human cells are suitable and easily accessible to address the intracellular fate of both, the PS in the dark and its polymeric carrier [36,37]. Interactions of drug delivery systems with cells encompass their cell uptake pathways, intracellular distribution and induction of specific cell metabolite alterations. Understanding these key processes allows assessing their in vivo tolerability, toxicity and efficacy in transporting their payloads to the target [36].

High resolution magic angle spinning (HR-MAS) NMR spectroscopy can be used to study intracellular small molecules giving rise to  $^1\text{H}$  NMR signals with atomic resolution. Moreover, the metabolic response of cultured living cells to interventions like drug treatment or specific growth conditions can be addressed [38–40]. Whole cell spectra are evaluated for qualitative alterations and for quantitative altered metabolite ratios based on multivariate analysis. This metabolomic approach is an emerging technique applied in nanotoxicological studies to identify alterations in endogenous small metabolites induced by NPs [41]. It has already proved an efficient tool for nanotoxicological investigations employing NMR analysis of cell extracts [42,43], culture media to determine the extracellular metabolites [44] or HR-MAS NMR of whole cells [45].

PVP and KP micelles represent two delivery systems with different chemical composition and structure, which in turn modify the dynamic properties of the corresponding systems including Ce4 release and reactivity toward proteins [31]. In this study, we aim to address the question how PVP and KP-micelles affect the intracellular fate of Ce4, and the metabolic response of cancer cells following treatment with Ce4 alone or encapsulated into the carriers. For this, HR-MAS NMR spectroscopy was applied to cultured HeLa cells following incubation with the different test media in the dark. The results will allow assessing the extent of physiological interference of the PVP and BCM-based carriers as well as the —in the dark— non-toxic porphyrinic PSs on a molecular or even atomic level. Knowledge of the metabolic perturbation will help predicting the in vivo tolerability of Ce4 or related PSs including the impact of PVP or BCM carriers in the dark during the accumulation period preceding PDT.

## 2. Materials and Methods

### 2.1. Chemicals

Ce4 was purchased from Frontier Scientific (Logan, Utah), PVP (average MW = 10 kDa) and Kolliphor P188 (KP, average MW = 8.4 kDa) were obtained from Sigma-Aldrich (Buchs, Switzerland). The deuterated solvents DMSO- $d_6$  (99.95%) and  $\text{D}_2\text{O}$  (99.9%) were purchased from Cambridge Isotopes Laboratories, Inc (Andover, MA, USA). Phosphate buffered saline (PBS, 50 mM, pH = 7.3) was prepared by mixing aliquots of 50 mM solutions of  $\text{KH}_2\text{PO}_4$  and  $\text{Na}_2\text{HPO}_4$  (provided by Sigma-Aldrich) in  $\text{H}_2\text{O}$  or  $\text{D}_2\text{O}$  containing 0.9 % NaCl.

### 2.2. Cell culture

The human HeLa cervical cancer cell line was kindly provided by the group of Prof. Mühlemann, University of Bern. For cell culture, phenol red free Dulbecco's Modified Eagle's Medium (DMEM) was prepared by diluting DMEM powder (D5030-1L, Sigma) in 1L distilled water and adding L-glutamine, sodium bicarbonate, D-glucose, and sodium pyruvate (all Sigma-Aldrich). The growth medium was supplemented with 10 % fetal calf serum (FCS), 100  $\mu\text{g}/\text{mL}$  streptomycin (S) and 100 IU penicillin (P, DMEM+/+). The cells were grown at 37°C in 5%  $\text{CO}_2$  under humid atmosphere. Trypsin-EDTA (T/E) with 0.5 g/L trypsin (1:250) and 0.2g/L EDTA-4Na, FCS, P and S were obtained from Amimed (BioConcept, Allschwil, Switzerland). The culture medium was sterile filtered through 0.1  $\mu\text{m}$  polyethersulfone (PES) membranes (Nalgene™ Rapid-Flow™, Thermo Fisher Scientific).

### 2.3. Cellular uptake by flow cytometry

Relative quantitative uptake of Ce4 alone and combined with PVP and KP into HeLa cells was measured applying flow cytometry.

Time-dependent uptake curves were recorded using the Amnis Image Stream<sup>®</sup> Mark II imaging flow cytometer (Luminex Corporate, Austin, TX, U.S.). Hela-cells were incubated with loading media containing either no additives (controls) or 5  $\mu\text{M}$  Ce4 with and without PVP (16.7  $\mu\text{M}$ ) or KP (3 mM) for 0.5 h, 1 h, 2 h, and 3 h. The incubation was stopped by removing the loading media, followed by washing, trypsinization and resuspension of the cells in DMEM +/+. After addition of the PSs, all sample preparation steps were performed under exclusion of light. Laser excitation was performed

at  $\lambda = 405\text{ nm}$  (2 mW) and fluorescence detection at  $\lambda = 642\text{--}745\text{ nm}$  in addition to bright-field and side-scattering detection. Data were processed using the IDEAS® 6.2 software (Amnis Corporation, Seattle, WA, U.S.). On a subpopulation of single spherical cells, the normalized (by number of pixels) mean fluorescence intensity per cell was determined and for all sample classes, the mean fluorescence intensity of all events (8000 – 10’000 cells) for each class and incubation time was plotted as function of time.

Dose-dependent uptake was recorded using a SORP LSR II flow cytometer (BD Biosciences, Franklin Lakes, New Jersey, U.S.) and the FACSDiva software, Version 8.0.1 (BD Biosciences). HeLa-cells were incubated with loading media containing either no additives (controls) or Ce4 at concentrations of 10  $\mu\text{M}$ , 25  $\mu\text{M}$ , and 62.5  $\mu\text{M}$  each with and without PVP (208.3  $\mu\text{M}$ ) or KP (3 mM) for 2 h. All samples were prepared in triplicates. After incubation the cells were worked up as described above for the time-dependent uptake curves. A laser with a wavelength of 407 nm was used for excitation and the Brilliant Violet filter (660/20 nm, BV650) was used for measuring fluorescence emission. 10’000 events were recorded for each sample condition and replicate. Data analysis was performed using Flowing Software (version 2.5.1., Turku Bioscience, Turku, Finland). Side- and forward scattering areas were measured for the identification of intact single cells.

2.4. Sample classes for  $^1\text{H}$  HR-MAS NMR spectroscopy

For the  $^1\text{H}$  HR-MAS NMR spectroscopic study, HeLa cells were incubated with “loading media”, i.e. FCS- and P/S-free culture media (DMEM-/-) containing (i) Ce4 (10  $\mu\text{M}$ ), (ii) Ce4 (25  $\mu\text{M}$ ), (iii) Ce4 (62.5  $\mu\text{M}$ ), (iv) Ce4-PVP (10  $\mu\text{M}$ , 208.3  $\mu\text{M}$ ), (v) Ce4-PVP (25  $\mu\text{M}$ , 208.3  $\mu\text{M}$ ), (vi) Ce4-PVP (62.5  $\mu\text{M}$ , 208.3  $\mu\text{M}$ ), (vii) only PVP (208.3  $\mu\text{M}$ ), (viii) Ce4-KP (10  $\mu\text{M}$ , 3 mM), (ix) Ce4-KP (25  $\mu\text{M}$ , 3 mM), (x) Ce4-KP (62.5  $\mu\text{M}$ , 3 mM), (xi) only KP (3 mM), (xii) and (xiii) pure PBS as controls (two times). Each of the samples (i – xiii) was individually prepared from one culture flask in triplicate resulting in 39 (3 x 13) cell samples in total. The sample groups and their labels are summarized in Table 1.

Table 1. Cell sample groups and their labels used throughout this study.

Ce4 conc. [ $\mu\text{M}$ ]	Carrier		
	none	PVP [208.3 $\mu\text{M}$ ]	KP [3 mM]
0	Ctrl1, Ctrl2	PVP	KP
10	Ce4-10	PVP-Ce4-10	KP-Ce4-10
25	Ce4-25	PVP-Ce4-25	KP-Ce4-25
62.5	Ce4-62.5	PVP-Ce4-62.5	KP-Ce4-62.5

2.5. Preparation of the loading media i - xiii

For the loading media the following stock solutions were prepared: 2 mM Ce4 in PBS ( $\text{H}_2\text{O}$ ) containing 10% DMSO, 60 mM KP in PBS ( $\text{H}_2\text{O}$ ) and 20.83 mM PVP in PBS ( $\text{H}_2\text{O}$ ). Aliquots of these stock solutions were mixed with DMEM-/- culture medium to yield final concentrations of Ce4 (10  $\mu\text{M}$ , 25  $\mu\text{M}$ , 62.5  $\mu\text{M}$ ), of KP (3 mM) and PVP (208.3  $\mu\text{M}$ ). Since Ce4 required 10% DMSO for dissolution to prepare the stock solution, the same amount of DMSO was also added to all other samples. Each loading medium contained thus the same final amount of 10.9 % PBS and 0.3 % DMSO, which is below the toxic DMSO concentration for HeLa cell cultures [46,47]. The final concentration of KP (3 mM) had to be chosen such that it was above the critical micelle concentration (cmc) of KP to ensure the existence of KP-micelles (0.45 mM in PBS [29]). In case of PVP, the concentration of 208.3  $\mu\text{M}$  was selected to ensure sufficient loading capacity for the highest Ce4 concentration of 62.5  $\mu\text{M}$  corresponding to a molar ratio of 3 : 10 (Ce4 : PVP) [31]. The loading media were sterile filtered through 0.1  $\mu\text{m}$  PES membranes (Nalgene™ Rapid-Flow™, Thermo Fisher Scientific) before incubation.



## 2.6. Preparation of cell samples for $^1\text{H}$ HR-MAS NMR spectroscopy

Initially 3 batches of HeLa cells (labelled “a”, “b”, and “c”) were grown each in six 75 cm<sup>2</sup> culture flasks in 10 mL DMEM+/+ to approximately 80% confluence to provide enough cell material for 13 samples (i – xiii) per batch. For each sample, HeLa cells were seeded at  $\sim 0.75 \times 10^6$  cells/mL in 25 cm<sup>2</sup> flasks using 5 mL ( $\sim 3.75 \times 10^6$  cells per sample) DMEM+/+ and allowed to grow for 24 h. Subsequently, the culture medium was removed, and the cells were washed with PBS (H<sub>2</sub>O). Beginning with the addition of the loading media the cell culture samples and all work-up processes were strictly excluded from light exposure to avoid phototoxic reactions of the PS. For this, the culture flasks and Falcon tubes were wrapped with alumina foil and the light was turned off in the laboratory during cell handling. After addition of 5 mL loading medium the cells were incubated for 2 h at 37°C in 5% CO<sub>2</sub> atmosphere. Then, the loading medium was removed, the cells were washed with PBS (H<sub>2</sub>O) and harvested by trypsinization. The cells were transferred to 15 mL Falcon tubes and centrifuged at 2000 rcf for 5 min. The supernatant was removed, and the cell pellet was washed three times with PBS (H<sub>2</sub>O), finally resuspended in 20  $\mu\text{L}$  D<sub>2</sub>O-based PBS and transferred to a black Eppendorf vial. To stop the metabolism, cells were lysed by three alternating cycles of ultrasonication (45 s) and submersion into liquid nitrogen (15 s) [48]. Frozen samples were stored at -80°C until measurement.

At the day of use, the cell sample was thawed within 2 min and heated for 20 min at 70°C to inactivate enzymes and ensure stability during the measurement time [48]. Finally, the lysed and heated cell suspension ( $\sim 5 \times 10^6$  cells in PBS-D<sub>2</sub>O,  $\sim 50$  mg) was transferred to a 50  $\mu\text{L}$  zirconium oxide MAS rotor and the rotor was briefly centrifuged ( $\sim 5$  s) to avoid any air bubbles before closing it with a PTFE Teflon insert and KelF rotor cap. The amount of sample inside the rotor was controlled by weight.

## 2.7. $^1\text{H}$ HR-MAS NMR spectroscopy – data acquisition

All HR-MAS NMR experiments were performed on a Bruker Avance II spectrometer (Bruker BioSpin, Fällanden, Switzerland) operating at a resonance frequency of 500.13 MHz for  $^1\text{H}$  nuclei. The instrument was equipped with a 4 mm HR-MAS dual inverse  $^1\text{H}/^{13}\text{C}$  probe (Bruker BioSpin) with a magic angle gradient. The samples were inclined around the magic angle (54.7°), spun at 5000 Hz and the temperature was set to 273 K (nominal). Data acquisition was performed with the Bruker software TopSpin (version 3.2, patch level 5). All samples were measured in random order and the time between thawing and start of acquisition was kept constant (47 min  $\pm$  8 min). For each sample, the following spectra were recorded: (i) T<sub>2</sub>-edited  $^1\text{H}$  spectra using the 1D PROJECT (Periodic Refocusing Of J Evolution by Coherence Transfer [49]) pulse sequence with water pre-saturation (“*projectpr1d*”) and a T<sub>2</sub> filter of 400 ms to suppress broad components with short T<sub>2</sub> relaxation times. 512 transients were accumulated for each 1D  $^1\text{H}$  spectrum, applying a spectral width of 6009.6 Hz, a data size of 32 k points, an acquisition time of 2.73 s, and a relaxation delay of 4 s. (ii)  $^1\text{H}$  spectra using a 1D NOESY (Nuclear Overhauser Enhancement Spectroscopy) pulse sequence (“*noesygppr1d*” from the Bruker pulse-program library) with spoil gradients for water suppression. 256 transients were acquired over a spectral width of 5000 Hz with a data size of 32 k points, a mixing time of 10 ms, an acquisition time of 3.28 s, and a relaxation delay of 4 s. (iii) 1D  $^1\text{H}$  diffusion edited spectra applying the 1D DOSY (Diffusion Ordered Spectroscopy) stimulated echo pulse sequence (“*ledbpgppr2s1d*” from the Bruker pulse-program library) with longitudinal eddy current delay of 5 ms, bipolar gradients for diffusion, 2 spoil gradients and presaturation of the water resonance. Each spectrum was recorded with 256 transients, a spectral width of 6009.6 Hz, a data size of 32 k points, and a relaxation delay of 2 s. To suppress small fast diffusing metabolites, a gradient was applied at 40 % of the maximal gradient strength corresponding to 13.5 G/cm applying a sine-shaped gradient. The diffusion time  $\Delta$  was set to 50 ms and the gradient length  $\delta$  to 6 ms.

On selected samples, 2D DOSY spectra (“*ledbpgppr2s*” from the Bruker pulse-program library) were acquired using the same parameters as for the 1D DOSY spectra applying an incremented linear gradient ramp from 5 to 95% over 64 steps with 16 scans per increment.

To support resonance assignments, 2D  $^1\text{H}$ - $^1\text{H}$  TOCSY (TOtal Correlation SpectroscopY) spectra were acquired on a representative subset of samples applying the DIPSI2 pulse sequence ("*dipsi2phpr*" from the Bruker pulse program library) with presaturation of the water resonance.

### 2.8. Processing of $^1\text{H}$ HR-MAS NMR spectra

Spectral processing was performed using the Bruker Topspin software (version 3.5b, patch level 7). For the 1D PROJECT and 1D NOESY spectra, exponential multiplication of the FIDs with a line-broadening factor of 1.0 Hz was performed followed by phasing and baseline correction. The baseline offset was corrected (zero order polynomial) for the whole spectral range and for the 1D PROJECT spectra a 5<sup>th</sup> order polynomial baseline correction was in addition applied to the spectral region between 5.1 ppm and 10 ppm. Chemical shifts were referenced to the  $-\text{CH}_3$  resonance of creatine (Cre) at  $\delta = 3.03$  ppm. For the 1D DOSY spectra, an exponential multiplication of the FIDs with a line broadening factor of 5 Hz was applied. The spectra were phased, baseline corrected (zero order polynomial over the whole spectral range) and referenced to the  $-\text{CH}_3$  resonance of choline (Cho) at  $\delta = 3.208$  ppm. 2D DOSY spectra were processed using the Bruker software "Dynamics Center" (version 2.6.2) by fitting the peak intensities of selected peaks as function of gradient strength with a bi-exponential fitting function.

Assignment of the resonances was based on  $^1\text{H}$ - $^1\text{H}$  TOCSY spectra (Figures S1 A-C), spectral databases (Human Metabolome Database, HMDB [50] and in-house database) and literature data [45,51–54].

### 2.9. Data Analysis

Multivariate analyses of the 1D PROJECT spectra were performed using MATLAB R2019b (The MathWorks, Inc., Natick, MA, USA), PLS Toolbox (version 8.8.1, Eigenvector Research, Inc., Manson, WA, USA) and Excel (Microsoft Office 365 ProPlus, Redmond, WA, USA).

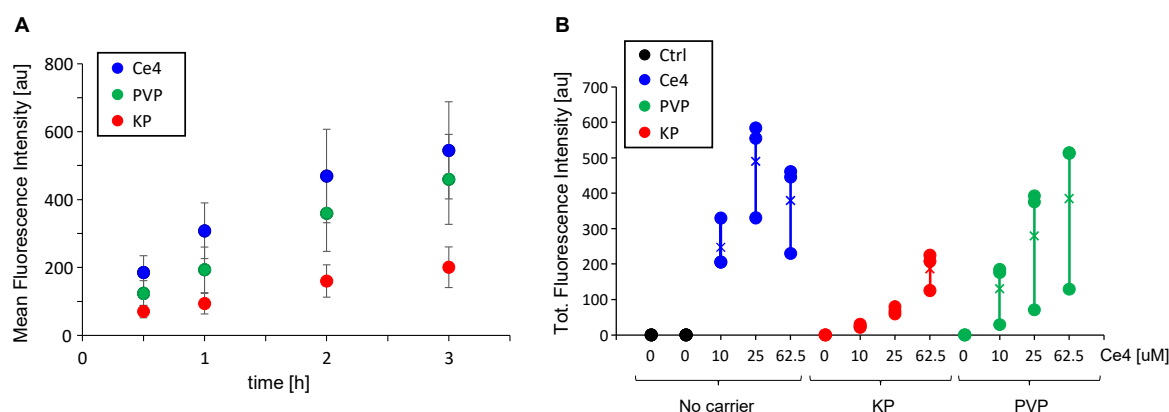
The 39  $^1\text{H}$  HR-MAS NMR spectra were subdivided in the spectral range between 0.8 and 9.5 ppm into 259 individually sized buckets (integral regions) excluding regions with noise, with the residual water resonance (4.8–5.25 ppm), with the ethanol resonance, and with the PEG- $\text{CH}_2$  and PPG- $\text{CH}_3$  resonances of KP (1.11–1.2 ppm and 3.62–3.74 ppm). Bucket selection was performed on an overlay of all spectra followed by integration in the corresponding regions using the TopSpin software. The integrals were imported into PLS-Toolbox for further analysis of the 39 x 259 data matrix. To account for differences in sample amounts, probabilistic quotient normalization (PQN) [55] was applied to the integrals of each sample. Furthermore, preprocessing included mean centering and Pareto scaling. The data were subdivided into 12 classes according to (i) – (xii) (see chapter 2.4) with the six control samples (xii, xiii) belonging to one class. Unsupervised principal component analysis (PCA) was performed to probe for sample clustering. Partial least squares discriminant analysis (PLS-DA) was used to calculate a model for distinguishing the spectra based on the assignment to 12 classes. Orthogonal partial least squares analysis (oPLS) was applied to calculate a regression model for predicting concentration dependent metabolite alterations. Cross validation for PCA, PLS-DA and oPLS was performed by venetian blinds with 10 splits and a blind-size of 1. Model statistics (root mean square error of calibration/cross validation, RMSEC / RMSECV) and classification errors were calculated for PCA and PLS-DA. Validation metrics  $R^2$  and  $Q^2$  were calculated for the linear oPLS regression model. Univariate analysis was performed on single metabolites (representative buckets/integrals) in Excel.

## 3. Results and Discussion

### 3.1. Cell uptake of Ce4 and the polymeric carriers PVP and KP

To quantify the cellular uptake of Ce4 depending on its formulation, i.e., either in its free form or encapsulated into PVP or KP micelles, HeLa cells were measured by flow cytometry following treatment with the corresponding samples added to the culture medium. For this, the intrinsic fluorescence intensity of Ce4 associated with the HeLa cells was recorded. Both, time-dependent

uptake for a fixed Ce4 concentration of 5  $\mu\text{M}$  (Figure 2A) and concentration-dependent uptake during a fixed time of 2h (same Ce4 concentrations as applied in the HR-MAS NMR study, Figure 2B) were measured. Ce4 uptake by HeLa cells was time-dependent and marginally levelled off after approximately 2–3 hours. It was slightly reduced when Ce4 was encapsulated in PVP and distinctly reduced in the presence of KP micelles (Figure 2A). This reduction was also found for the Ce4 concentration range of 10–62.5  $\mu\text{M}$  when applied with carriers (Figure 2B). In the presence of PVP or KP, cell uptake increased with Ce4 concentration without reaching saturation and was always lower than Ce4 in its free form, except for Ce4-PVP at 62.5  $\mu\text{M}$  Ce4. In the absence of carriers, a fluorescence drop was observed at the highest Ce4 level (62.5  $\mu\text{M}$ ). At this concentration, chlorin aggregation becomes prevalent leading to pronounced fluorescence quenching [31] so that the measured fluorescence intensity no longer correlates with the actual intracellular Ce4 concentration. In contrast, these aggregation and quenching effects are prevented through the encapsulation of Ce4 into PVP or KP, where it exists in the monomeric state [31].



**Figure 2.** Ce4 uptake into HeLa cells measured as intrinsic fluorescence following addition of Ce4 alone (blue), encapsulated into PVP (green) or KP (red) **(A)** as function of incubation time (5  $\mu\text{M}$  Ce4, 16.7  $\mu\text{M}$  PVP, 3 mM KP) and **(B)** as function of Ce4 concentration (208.3  $\mu\text{M}$  PVP, 3 mM KP, 2h incubation).

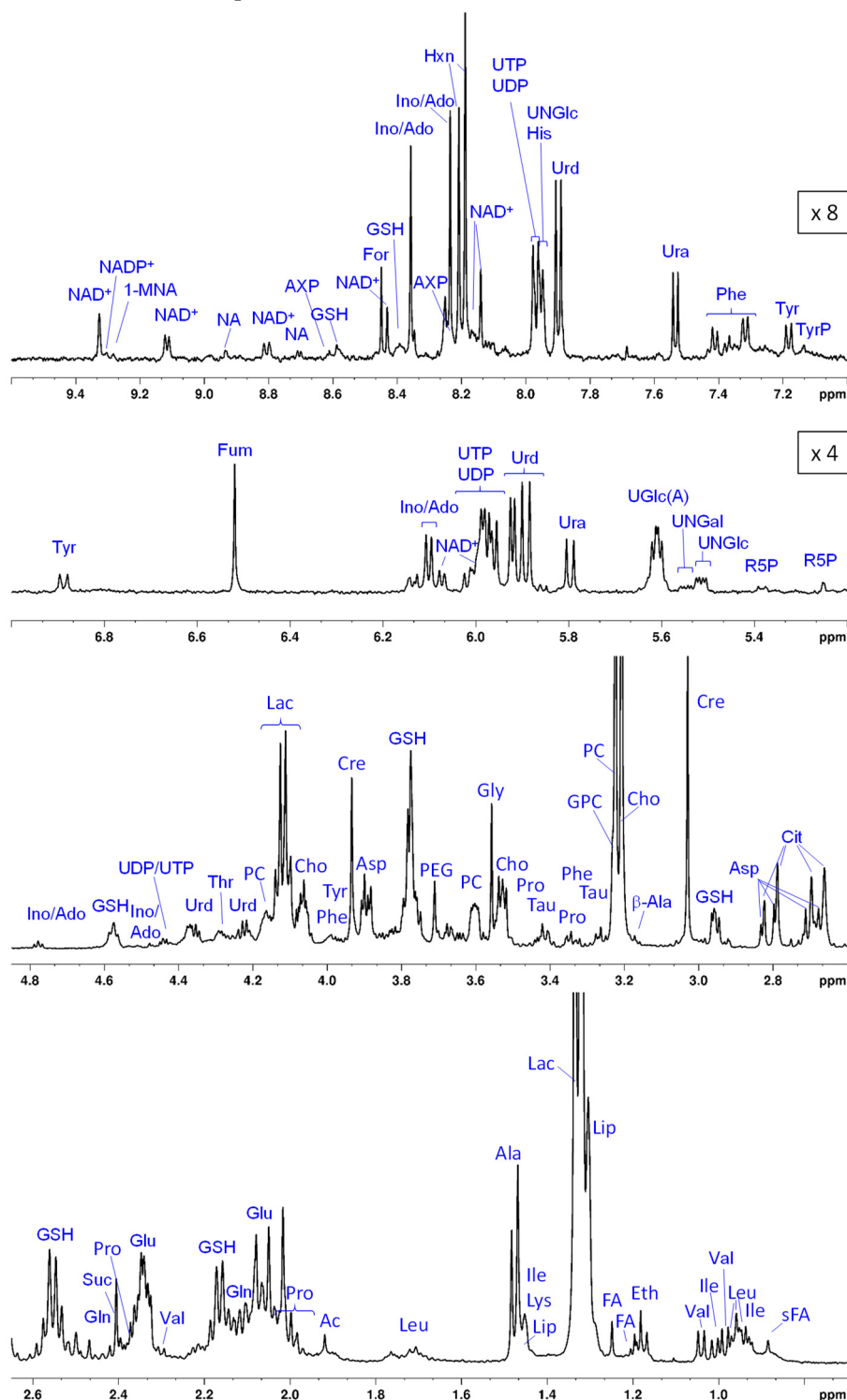
Reduced cellular drug uptake from Pluronic micelles has been previously reported [31,56] and discussed in detail with respect to a single incubation time [31]. Possible causes for a reduced uptake of PEGylated lipid NPs by tumor cells have been related to steric hindrance and blocking of ligands at the cell surface through PEG chains. These drawbacks accompanying the advantages of PEGylated lipid NPs were denoted as the “PEG-dilemma” [57,58]. Under in vivo conditions, the disadvantage of reduced cell uptake is partly compensated by the enhanced stability and prolonged lifetime of the drug loaded NPs during the transport in the bloodstream. This is mainly due to the stealth effect of the PEG corona preventing the opsonization process [59] as well as to the EPR-mediated accumulation of PEGylated NPs in tumor tissue [11]. These effects are however not reflected in the in vitro cell culture model.

### 3.2. The metabolic profile of treated and untreated HeLa-cells: $T_2$ -edited $^1\text{H}$ HR-MAS NMR spectra

In Figure 3, a summed  $T_2$  filtered (PROJECT)  $^1\text{H}$  HR-MAS NMR spectrum of all lysed HeLa cell suspensions in PBS is shown. Typically, with the relaxation filter, underlying broad peaks deriving from large molecules like proteins, lipids, or polysaccharides are suppressed facilitating the analysis of small molecules that give rise to sharp resonances. Each single spectrum provides a metabolic snapshot of the cells following their different exposures to the various test media (i–xiii). A total of 53 compounds could be identified that are summarized in Table 2 along with their abbreviations, chemical shifts and multiplicities. The most prominent peaks originate from cell metabolites such as Lac, mobile lipids (Lip), the choline containing compounds Cho, PC, and GPC, Cre and several amino acids like Gln, Leu, Ile, and Val. The spectral region between 5 ppm and 10 ppm that typically exhibits resonances of much lower intensity is dominated by contributions from nucleosides, nucleotides, and



related components such as UDP- and UTP derivatives. Among those, the nucleotide sugars UNGlc, UNGal, and UGlcA (most likely overlapping with UGlc) are assigned based on the resonances deriving from their anomeric protons around 5.6 ppm with the characteristic multiplet structure [52]. The assignment of the purine-derived metabolites Ino and Ado remains ambiguous since the chemical shift values of the two single purine resonances are hard to distinguish (annotation Ino/Ado). In addition, there is a pronounced pH-dependence in the chemical shifts of adenine-derived nucleotides (AXP) as previously discussed [53]. In the current study, AXP, most likely AMP [53,60], as well as UMP were only observed in the spectra of samples treated with Ce4. Furthermore, among the compounds listed in Table 2, some were only detectable in the presence of KP or without application of a T<sub>2</sub>-filter (see chapter 3.3. below).



**Figure 3.** <sup>1</sup>H HR-MAS NMR summed PROJECT spectrum of lysed HeLa cell suspension in PBS with resonance assignments (for abbreviations, see Table 2.) Spectral regions of 5.2–7.0 ppm and 7.0–9.6 ppm were scaled up by a factor of 4 and 8, respectively.

**Table 2.** Signal assignment with chemical shift and multiplicity of proton resonances from HeLa lysed cell suspension (PBS).

Compound	Abbreviation	Chemical shift [ppm]	Multipl.	Group
<i>Amino acids</i>				
Alanine	Ala	1.477	(d)	β-CH <sub>3</sub>
		3.779	(q)	α-CH
Arginine	Arg	1.656	(m)	γ-CH <sub>2</sub>
		3.214	(t)	δ-CH <sub>2</sub>
Aspartate	Asp	2.689	(m)	β-CH <sub>2</sub>
		2.814	(m)	β-CH <sub>2</sub>
Glutamate	Glu	3.894	(m)	α-CH
		2.043	(m)	β-CH <sub>2</sub>
		2.346	(m)	γ-CH <sub>2</sub>
		3.766	(t)	α-CH
Glutamine	Gln	2.138	(m)	β-CH <sub>2</sub>
		2.448	(m)	γ-CH <sub>2</sub>
		3.778	(t)	α-CH
Glycine	Gly	3.558	(s)	α-CH <sub>2</sub>
Histidine <sup>a</sup>	His	7.95	(s)	2-CH (imid)
		7.14	(s)	4-CH (imid)
Isoleucine	Ile	0.937	(t)	δ-CH <sub>3</sub>
		1.009	(d)	γ'-CH <sub>3</sub>
		1.257	(m)	γ-CH <sub>2</sub>
		1.461	(m)	γ-CH <sub>2</sub>
		1.982	(m)	β-CH
		3.673	(d)	α-CH
Leucine	Leu	0.959	(d)	δ-CH <sub>3</sub> , δ'-CH <sub>3</sub>
		1.709	(m)	γ-CH, β-CH <sub>2</sub>
		3.744	(t)	α-CH
Lysine	Lys	1.462	(m)	γ-CH <sub>2</sub>
		1.703	(m)	δ-CH <sub>2</sub>
		1.883	(m)	β-CH <sub>2</sub>
Phenylalanine	Phe	3.003	(t)	ε-CH <sub>2</sub>
		7.317	(d)	-CH
		7.367	(t)	-CH
		7.411	(d)	-CH
		3.994	(m)	α-CH
		3.273	(m)	β-CH <sub>2</sub>
Proline	Pro	3.131	(m)	β-CH <sub>2</sub>
		2.03	(m)	γ-CH <sub>2</sub>
		2.352	(m)	β-CH <sub>2</sub>
		3.333	(m)	δ'-CH <sub>2</sub>
		3.415	(m)	δ''-CH <sub>2</sub>
Threonine	Thr	4.145	(m)	α-CH
		1.33	(d)	γ-CH <sub>3</sub>
		3.587	(d)	α-CH
		4.257	(m)	β-CH

Tyrosine	Tyr	6.887	(d)	-CH
		7.182	(d)	-CH
		3.943	(m)	$\alpha$ -CH
		3.205	(m)	$\beta$ -CH <sub>2</sub>
		3.052	(m)	$\beta$ -CH <sub>2</sub>
Valine	Val	0.985	(d)	$\gamma$ -CH <sub>3</sub>
		1.041	(d)	$\gamma'$ -CH <sub>3</sub>
		2.272	(m)	$\beta$ -CH
		3.613	(d)	$\alpha$ -CH
Peptides				
Glutathione	GSH	2.166	(m)	$\beta$ -CH <sub>2</sub> (Glu)
		2.554	(m)	$\gamma$ -CH <sub>2</sub> (Glu)
		2.958	(dd)	$\beta'$ -CH <sub>2</sub> (Cys)
		3.780	(s)	$\alpha''$ -CH (Gly)
		3.787	(t)	$\alpha$ -CH (Glu)
		4.577	(m)	$\alpha'$ -CH (Cys)
		8.393		-NH (Gly)
		8.587		-NH (Cys)
Lysine containing peptide b	LysP	1.462	(m)	$\gamma$ -CH <sub>2</sub>
		1.703	(m)	$\delta$ -CH <sub>2</sub>
		3.003	(t)	$\varepsilon$ -CH <sub>2</sub>
Tyrosine containing peptide	TyrP	6.813	(br)	-CH
		7.112	(br)	-CH
Organic acids				
Acetate	Ac	1.919	(s)	-CH <sub>3</sub>
Citrate	Cit	2.68	(d)	-CH <sub>2</sub>
		2.811	(d)	-CH <sub>2</sub>
Formic acid	For	8.45	(s)	-CH
Fumarate	Fum	6.519	(s)	CH=CH
Lactate	Lac	1.33	(d)	$\beta$ -CH <sub>3</sub>
		4.121	(q)	$\alpha$ -CH
Succinate	Suc	2.405	(s)	-CH <sub>2</sub>
Amines				
$\beta$ -Alanine	$\beta$ -Ala	2.57	(t)	$\alpha$ -CH <sub>2</sub>
		3.18	(t)	$\beta$ -CH <sub>2</sub>
Creatine	Cre	3.03	(s)	-CH <sub>3</sub>
		3.934	(s)	-CH <sub>2</sub>
Taurine	Tau	3.264	(t)	SO <sub>3</sub> H-CH <sub>2</sub>
		3.421	(t)	NH <sub>2</sub> -CH <sub>2</sub>
Choline containing compounds				
Choline	Cho	3.208	(s)	-N <sup>+</sup> (CH <sub>3</sub> ) <sub>3</sub>
		3.528	(m)	N-CH <sub>2</sub>
		4.067	(m)	O-CH <sub>2</sub>
Glycerophosphocholine	GPC	3.233	(s, br)	-N <sup>+</sup> (CH <sub>3</sub> ) <sub>3</sub>
		3.695	(m)	N-CH <sub>2</sub>
		4.338	(m)	O-CH <sub>2</sub>
Phosphocholine	PC	3.224	(s)	-N <sup>+</sup> (CH <sub>3</sub> ) <sub>3</sub>
		3.605	(m)	N-CH <sub>2</sub>
		4.166	(m)	O-CH <sub>2</sub>

Phosphatidylcholine <sup>b</sup>	PLC	3.273	(s, br)	-N <sup>+</sup> (CH <sub>3</sub> ) <sub>3</sub>
<i>Nucleobases, nucleosides, nucleotides</i>				
Adenosine phosphate <sup>c, d</sup>	AXP	8.62	(s)	8-CH
		8.228	(s)	2-CH
Hypoxanthine	Hxn	8.188	(s)	8-CH
		8.208	(s)	2-CH
Inosine/Adenosine <sup>d</sup>	Ino/Ado	8.235	(s)	8-CH
		8.358	(s)	2-CH
		6.101	(d)	1'-CH (Rib)
		4.781	(t)	2'-CH (Rib)
		4.471	(m)	3'-CH (Rib)
1-Methylnicotinamide <sup>e</sup>	1-MNA	9.283	(s)	2-CH
		8.982	(s)	6-CH
		8.897	(d)	4-CH
		4.48	(s)	N <sup>+</sup> -CH <sub>3</sub>
NAD <sup>+</sup>	NAD <sup>+</sup>	9.325	(s)	2-CH (Nic)
		9.117	(d)	6-CH (Nic)
		8.804	(d)	4-CH (Nic)
		8.43	(s)	2'-CH (Ade)
		8.166	(t)	5-CH (Nic)
		8.139	(s)	8'-CH (Ade)
		6.074	(d)	1-CH (Rib)
NADP <sup>+</sup>	NADP <sup>+</sup>	9.305	(s)	2-CH (Nic)
Nicotinamide <sup>e</sup>	NA	8.933	(s)	2-CH
		8.706	(d)	6-CH
		8.235	(d)	4-CH
		7.582	(dd)	5-CH
Uridine monophosphate <sup>c</sup>	UMP	8.14	(d)	6-CH (Ura)
		5.998	(d)	5-CH (Ura)
Uracil	Ura	7.534	(d)	6-CH
		5.797	(d)	5-CH
Uridine	Urd	7.897	(d)	6-CH (Ura)
		5.894	(d)	5-CH (Ura)
		5.922	(d)	1'-CH (Rib)
		4.357	(m)	2',3'-CH (Rib)
		4.229		4'-CH (Rib)
		4.123		5a'-CH <sub>2</sub> (Rib)
		3.828		5b'-CH <sub>2</sub> (Rib)
Uridine triphosphate	UTP	7.965	(d)	6-CH (Ura)
		5.967	(d)	5-CH (Ura)
		5.985	(d)	1'-CH (Rib)
		4.375	(m)	2',3'-CH (Rib)
		4.282		4'-CH (Rib)
<i>Nucleotide-/ phosphate-sugars</i>				
Ribose-5-Phosphate	R5P	5.388	(dd)	1-CH
		5.257	(d)	1-CH
		4.129		2-CH
UDP-N-Acetyl-glucosamine	UNGlc	5.515	(dd)	1-CH (Glc)
		2.079	(s)	Ac-CH <sub>3</sub>



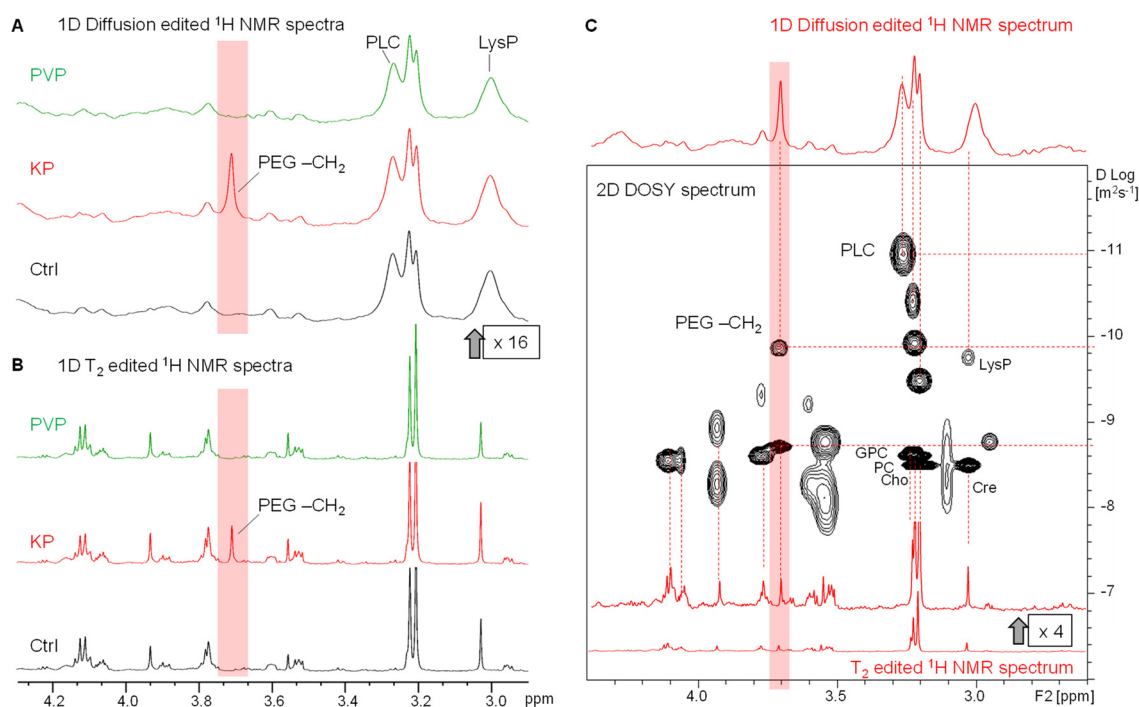
		4.378		2',3'-CH (Rib)
		4.289		4'-CH (Rib)
		5.963	(d)	5-CH (Ura)
		5.985	(d)	1'-CH (Rib)
		7.969	(d)	6-CH (Ura)
UDP-N-Acetyl- galactosamine	UNGal	5.548	(dd)	1-CH (Gal)
		2.085	(s)	Ac-CH <sub>3</sub>
		4.378		2',3'-CH (Rib)
		4.289		4'-CH (Rib)
		5.963	(d)	5-CH (Ura)
		5.985	(d)	1'-CH (Rib)
UDP- Glucose / UDP- Glucuronic acid <sup>d</sup>	UGlc(A)	5.612	(dd)	1-CH (Glc(A))
<i>Lipids</i>				
Fatty acids	FA	0.867	(br)	ω-CH <sub>3</sub>
		1.192	(br)	(-CH <sub>2</sub> ) <sub>n</sub>
		1.302	(br)	(-CH <sub>2</sub> ) <sub>n</sub>
Fatty acids (saturated)	sFA	0.883	(t)	ω-CH <sub>3</sub>
		1.615	(br)	β-CH <sub>2</sub> -
Lipids <sup>b</sup>	Lip	0.936	(t)	ω-CH <sub>2</sub> -
		1.293	(br)	(-CH <sub>2</sub> ) <sub>n</sub>
		1.628	(br)	β-CH <sub>2</sub>
		2.073	(br)	-CH <sub>2</sub> -CH=
		2.292	(br)	α-CH <sub>2</sub>
<i>Others</i>				
Ethanol	Eth	1.193	(t)	-CH <sub>3</sub>
		3.668	(q)	-CH <sub>2</sub>
Polyethylenglycol <sup>f</sup>	PEG	3.711	(s)	-CH <sub>2</sub>
Polypropylenglycol <sup>f</sup>	PPG	1.16	(br)	-CH <sub>3</sub>

<sup>a</sup> slight chemical shift variation (pH-sensitive); <sup>b</sup> only or mainly visible in diffusion weighted spectra (Figure S2);

<sup>c</sup> only in cell samples treated with Ce4 ; <sup>d</sup> assignment ambiguous; <sup>e</sup> low concentration (mainly visible in summed spectrum); <sup>f</sup> only in cell samples treated with KP.

### 3.3. The metabolic profile of treated and untreated HeLa-cells: Diffusion-edited <sup>1</sup>H HR-MAS NMR spectra

In 1D <sup>1</sup>H DOSY, small metabolites with a larger diffusion coefficient can be suppressed by adjusting the diffusion time and gradient strength during acquisition so that only the broad resonances of slowly diffusing macromolecular components remain visible. The effects of T<sub>2</sub> relaxation and diffusion filters on the <sup>1</sup>H NMR spectra are visualized in Figures 4 and S2 and contrasted to unfiltered 1D NOESY spectra covering both, sharp and broad components (Figure S2).



**Figure 4.** (A) HR-MAS  $^1\text{H}$  1D Diffusion-edited NMR spectra (scaled up by a factor of 16) and (B) HR-MAS  $^1\text{H}$ -T<sub>2</sub>-edited (PROJECT) NMR spectra of lysed HeLa cell suspensions in PBS. Cells incubated with PBS (controls, black), KP (red), and PVP (green). The PEG-CH<sub>2</sub> resonance was only visible in cells incubated with KP and is highlighted in red. (C) HR-MAS  $^1\text{H}$  2D DOSY spectrum of a cell suspension incubated with KP; 1D Diffusion- and 1D T<sub>2</sub> edited projections are shown in red. The PEG-CH<sub>2</sub> resonance corresponds to a slow and a fast diffusing component (highlighted in red).

### 3.3.1. Lipids and Oligopeptides

Mainly lipid resonances remained visible in the 1D DOSY spectra that were used besides TOCSY spectra (Figure S1) to assign the corresponding lipid moieties (Figure S2 and Table 2). This included also the characteristic broad  $-\text{N}^+(\text{CH}_3)_3$  PLC resonance of phospholipids at 3.27 ppm [61,62]. In addition, oligopeptides give rise to broader resonances that were mainly visible in diffusion-edited spectra, notably Tyr- and Lys-containing peptides [63] (TyrP, Figure S1 C and LysP, Figure 4 A). TyrP and LysP have similar chemical shift values compared to their amino acid counterparts [62] and exhibit analogous cross peaks in TOCSY (Figure S1).

### 3.3.2. Visibility of intracellular KP

Notably, in all spectra of HeLa cell samples that were treated with KP (alone or with encapsulated Ce4), the presence of the PEG-CH<sub>2</sub> resonance was clearly visible at 3.7 ppm (Figure 4 A and B). This indicates cell internalization of the block copolymer-based carrier KP. The fact that the PEG resonance visibility is maintained in the diffusion edited spectra points toward the presence of micelles or polymer aggregates inside the cell that may be coexistent with monomers. Since BCMs disintegrate upon dilution below their cmc, the KP concentration in the incubation media was selected well above the cmc to maintain micelles in the current study. For further investigation of the diffusion properties associated with the PEG-resonance at 3.7 ppm, 2D DOSY spectra were recorded, and the gradient strength dependent peak intensity decay curves of selected resonances were analyzed applying bi-exponential fitting (Figure S3). A corresponding 2D DOSY spectrum is shown in Figure 4 C for the spectral region between 2.5 ppm and 4.5 ppm with a 1D diffusion edited spectrum as projection (on top) showing the slow diffusing components and a T<sub>2</sub>-edited spectrum as projection (on the bottom) showing mainly the fast-diffusing components. In the DOSY spectrum, the diffusion coefficient (D-value) is given along the y-axis in logarithmic scale. The decay curve of

PEG-CH<sub>2</sub> was clearly bi-exponential indicating the existence of both, smaller and larger molecular assemblies, potentially whole micelles. Similarly, the resonances assigned to choline containing compounds represent small molecules (Cho, PC, and GPC) that dynamically behave like Cre as well as larger components, among which the PLC resonance of phospholipids gives rise to the smallest D-value.

Uptake mechanisms of polymeric micelles are not yet completely understood and often only their payload, i.e., the drug molecules, are traced inside the cell and not the carrier material itself. The cell uptake pathway of a related PEG-PPG-PEG polymer, namely Pluronic P85, was reported to be strictly concentration dependent [64]. While the single building blocks were internalized via caveolae-mediated and caveolae- and clathrin-independent endocytosis, P85 micelles were exclusively taken up via the classical clathrin-mediated endocytosis [13,64]. Moreover, the possibility of disintegration of polymeric micelles upon cell internalization has also been discussed leading to a separation of the polymer and drug molecules before uptake [65].

### 3.3.3. Invisibility of intracellular PVP

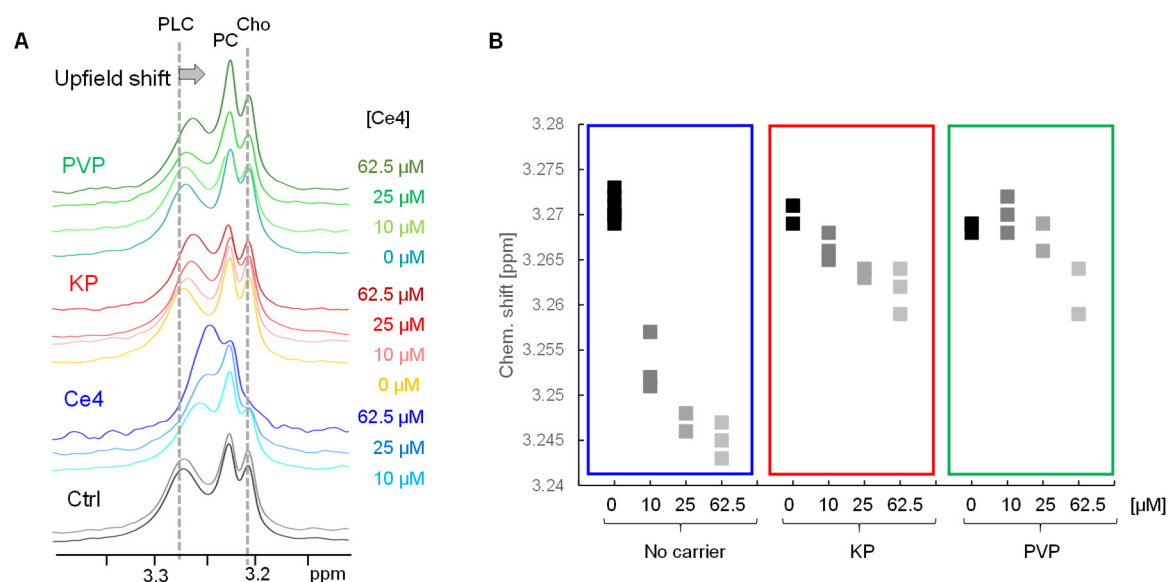
Unlike KP, no PVP resonances were visible in the spectra of PVP-treated cells. This may be due to the fact that the applied concentration of PVP was more than 10-fold lower than that of KP. In addition, the large and slowly tumbling PVP molecular network leads to fast T<sub>2</sub>-relaxation that is associated with broader linewidths. Consequently, the broad PVP resonances are suppressed in the T<sub>2</sub>-edited spectra as was demonstrated on a pure PVP sample in PBS with and without the T<sub>2</sub>-filter used in this study (Figure S4). However, when applying the diffusion-filter, the PVP resonances should be traceable if they exist in solution at sufficient concentration (Figure S4). Therefore, to probe for any intracellular NMR visibility of PVP, additional samples of HeLa cells were incubated with a high concentration (30 mM) of PVP and compared to cells incubated with equally concentrated KP in the culture medium. However, even at this high concentration PVP resonances were not detectable in the diffusion edited cell spectra (Figure S5). On the other hand, efficient uptake of PVP encapsulated Ce4 into HeLa cells was proved by flow cytometry in this study (Figure 2) and previously by confocal laser scanning microscopy [31]. While PVP may not be internalized but only release its payload into the HeLa cells, this assumption is rather unlikely according to literature reports on cellular uptake of NPs. As an example it could be shown that PVP covalently bound to hypericin was internalized into HeLa cells [66] and for octadecyl-modified PVP NPs, dynamin-dependent endocytosis was suggested as major uptake mechanism besides passive diffusion through the cell membrane [65,67,68]. Accordingly, it is most likely in the present work that intracellular PVP is associated with cellular macromolecular structures like proteins or membranes further increasing the line-broadening of the PVP resonances leading to their NMR-invisibility.

### 3.3.4. Indirect detection of intracellular Ce4

The direct observation of NMR resonances from intracellular Ce4 is concealed due to low concentration and possibly to Ce4 association with large molecules leading to pronounced line broadening. For example, previously it was shown that Ce4 binding to human serum albumin (HSA) is accompanied with the loss of visible Ce4 proton resonances in buffer solution [31]. A similar effect was observed upon insertion of Ce6 derivatives into phospholipid bilayers of DOPC (di-oleoyl-phosphatidylcholine) vesicles [61]. However, the strong ring current of porphyrinic macrocycles in magnetic fields [69] can induce considerable changes in NMR chemical shifts of biomolecules in close proximity allowing indirect porphyrin detection [70].

In the current study, such an induced chemical shift change could be observed in the diffusion edited spectra of cells that were incubated with Ce4. Whereas the Cho and PC resonances remained unchanged, a clear upfield shift of the PLC N-methyl choline resonance appeared. This upfield shift correlated with Ce4 concentration and was also detectable when Ce4 was applied with KP and PVP, but to a lower extent (Figure 5 A, B). This Ce4 ring current induced shift reflects a direct interaction with cellular phospholipids suggesting Ce4 association with phospholipid membranes. This is in agreement with the assumption that cellular membranes are the preferential intracellular localization

sites of porphyrinic PSs [71,72]. Our previous model studies on externally added amphiphilic Ce6 derivatives to unilamellar phospholipid vesicles as model membranes have suggested a preferential association with the choline containing head group regions of the phospholipids [61,73,74]. Therefore, the current approach provides the unique possibility to localize intracellular porphyrin not just on a molecular but even atomic level.



**Figure 5.** (A) HR-MAS  $^1\text{H}$ -diffusion-edited NMR spectra (1D-DOSY) of lysed HeLa cell suspensions in PBS incubated with different concentrations of Ce4 without carrier or encapsulated into KP or PVP. Shown is the spectral region where the choline containing resonances appear. The PLC resonance exhibits upfield shifts; (B) Chemical shift of the PLC-resonance as function of condition (Ce4 concentration and carrier).

The PLC-upfield shifts observed for the different Ce4 formulations (no carrier, KP, PVP) provide additional valuable information on the intracellular impact of the carrier. The magnitude of the ring-current induced shift depends on both, the local Ce4 concentration and the spatial proximity of the chlorin macrocycle to the membrane. This seems largest for Ce4 in its free form whereas KP and PVP have an attenuating effect, which is stronger for PVP despite higher Ce4 uptake with PVP compared to KP (Figure 2). Accordingly, it is more likely that the previously observed eased release of Ce4 from the micellar KP carrier [31] allows more direct association with cellular membranes as compared to PVP. The stronger binding of Ce4 to PVP suggests that either less free Ce4 is available for direct membrane association and / or that the whole Ce4-PVP assembly binds to the membrane leading to a spatial shielding of the chlorin ring current effect through the surrounding PVP network. Nevertheless, the presented NMR data underline the hypothesis that the nature of the carrier has a pronounced impact on the intracellular fate of the transported PS which is expected to modulate PDT efficiency.

### 3.4. Metabolic analysis of cell spectra: Impact of Ce4, PVP and KP

To probe the impact of Ce4 alone or encapsulated into PVP or KP micelles onto the metabolic profile of cultured HeLa-cells in the dark, cells were incubated under exclusion of light for 2 hours with three different Ce4 concentrations (10  $\mu\text{M}$ , 25  $\mu\text{M}$ , and 62.5  $\mu\text{M}$ ) in pure PBS, PVP or KP each at a constant polymer concentration in PBS. The polymers without Ce4 were also included and cells incubated with pure PBS added to the culture media served as controls. This resulted in 12 sample classes measured in triplicates and labelled as Ce4-10, Ce4-25, Ce4-62.5, KP, KP-Ce4-10, KP-Ce4-25, KP-Ce4-62.5, PVP, PVP-Ce4-10, PVP-Ce4-25, PVP-Ce4-62.5, and Ctrl (Table 1). The spectra were subdivided into individually sized bucket regions covering single resonances as much as possible.

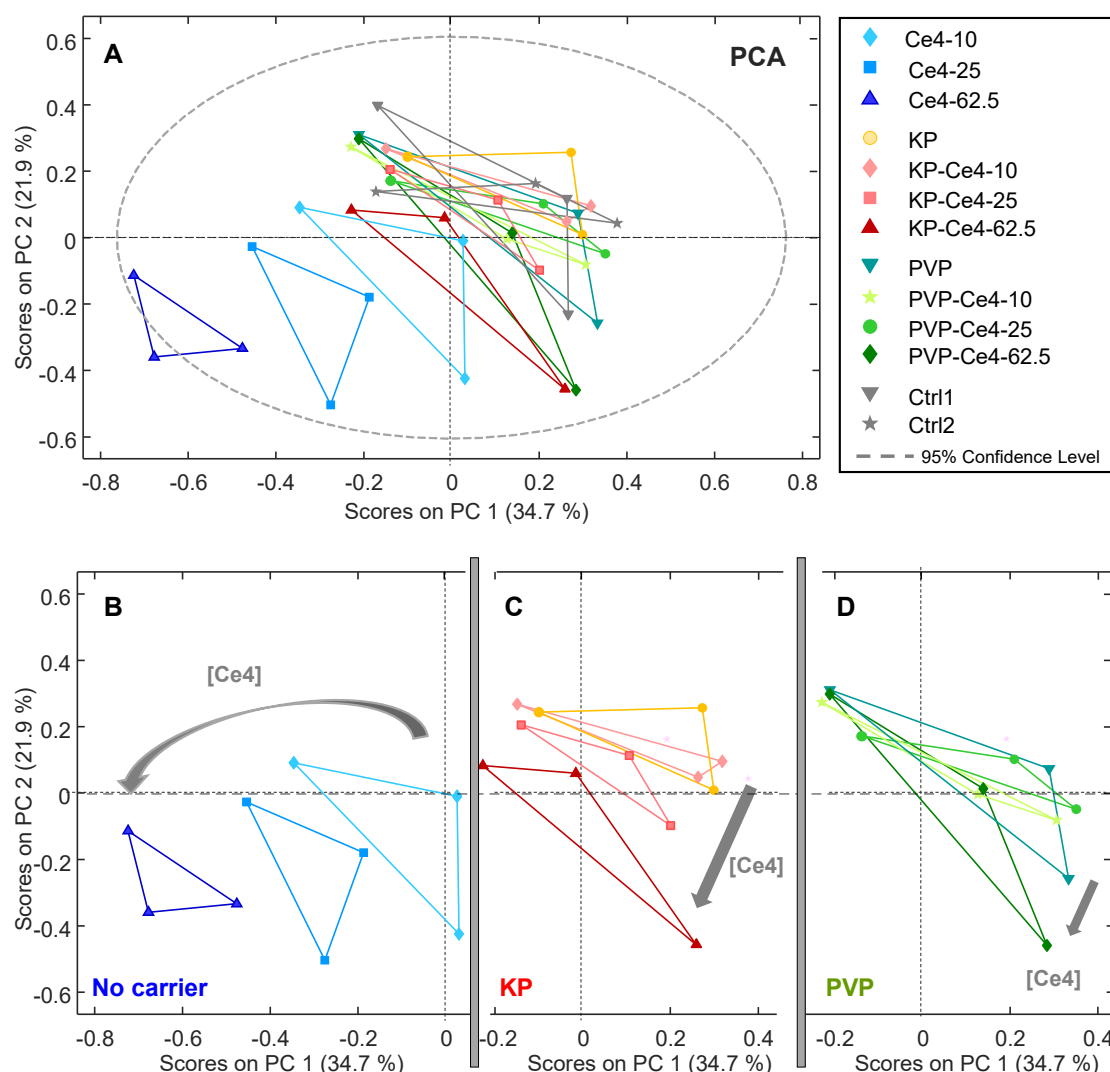


### 3.4.1. PCA

In a first step, unsupervised PCA was applied to all samples to make potential clustering of sample classes visible as well as probe for outliers. In Figure 6A, the PCA scores plot is displayed for the first two components PC-1 and PC-2 accounting for a total variance of 56.6 %. While the samples incubated with Ce4 without carrier, shown in blue, were well separated in the lower quarter of the plot with negative PC-1 and PC-2 scores, the remaining samples overlapped. For the carrier-free samples, there was a Ce4-concentration dependent shift towards increasingly negative scores along PC-1. A correlation with Ce4 concentration, even though less pronounced, was also observed for the samples with KP and PVP. To make this correlation better visible, the corresponding subgroups are shown separately as excerpts of the common plot shown in Figure 6A (Figure 6 B, C and D). These results indicate that Ce4 triggers a concentration dependent metabolic response in HeLa cells with different characteristics given by its form of application, i.e. free or carrier associated. Notably, in the PCA scores plot, the data points from each of the triplicates possessed a triangular arrangement. This was caused by the associated batches for each sample within a triplicate (a, b, or c) of independently prepared HeLa cells (see Experimental Section 2.6). Accordingly, within each batch, the samples cluster and there is a difference in the metabolic profile between these clusters mainly along PC-2 (Figure S6 A). The loading plot for PC-1 and PC-2 (Figure S6 B) reveals that the contributions derive from a few specific metabolites, mainly PC and Lac. This underlying difference can be explained by the variability inherent to independent biological samples causing systematic inter-batch variations sometimes encountered in metabolomic studies and referred to as "batch effect" in the literature [75]. However, despite these batch-dependent differences a clear clustering of sample classes for each condition (Ce4 concentration and carrier material) clearly superimposed the background variations. Therefore, this unsupervised PCA approach already reveals the presence of class-dependent metabolic alterations without the need of any background subtraction.

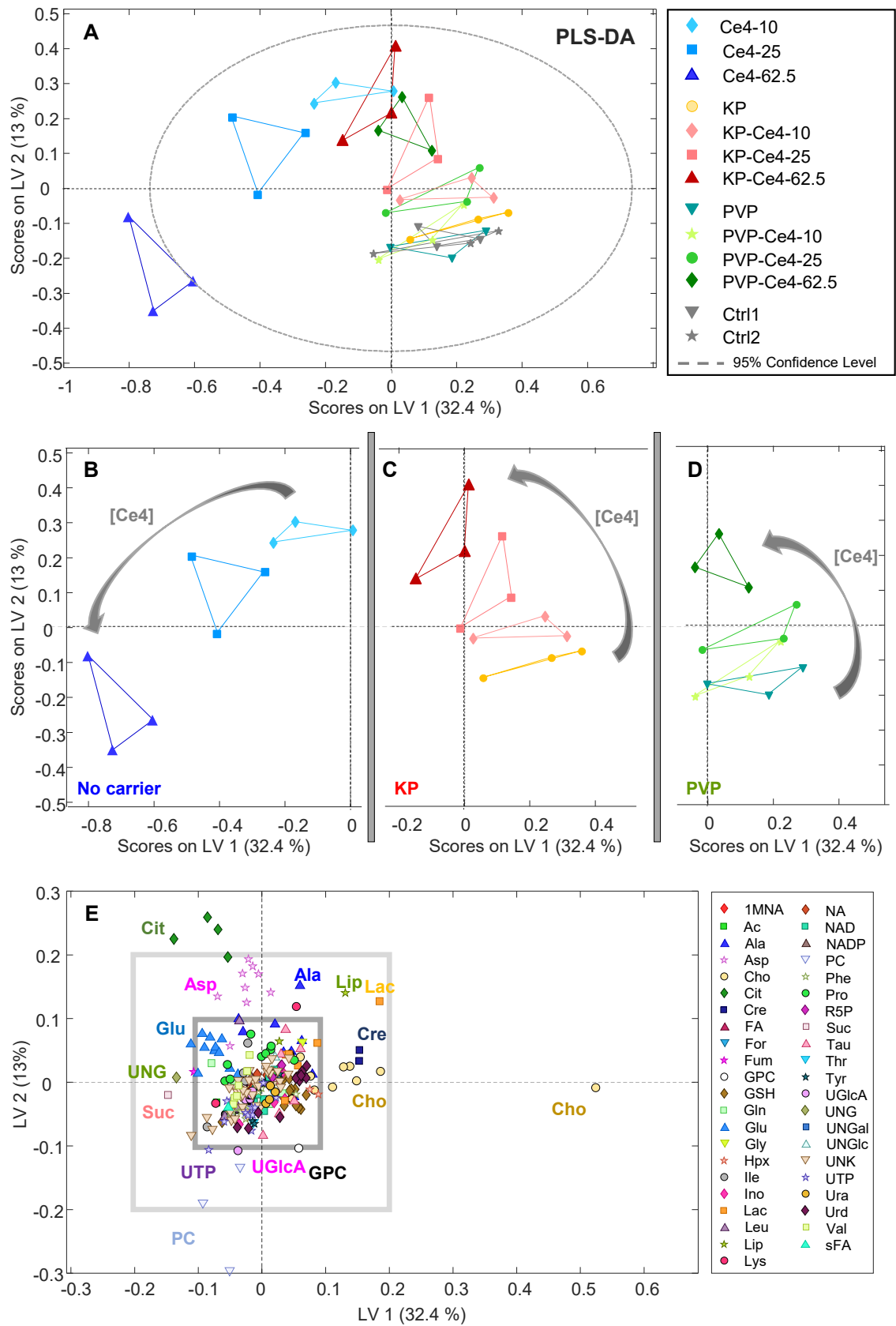
### 3.4.2. PLS-DA

In a next step, PLS-DA was performed on all samples to probe if the 12 classes could be distinguished according to the combined features of Ce4 concentration and formulation. The PLS-DA scores plot for the first two latent variables LV-1 and LV-2 is shown in Figure 7 A. The samples of the non-encapsulated Ce4 (blue) appear as the most separated group with negative scores on LV-1. The magnitude of the LV-1 score increases with Ce4 concentration. A similar but attenuated trend toward negative LV-1 scores can also be observed for KP- and PVP-encapsulated Ce4 where for each the samples at the highest concentration lie close to the carrier free Ce4 sample points (blue). The discrimination from the Ce4-free samples (Ctrl1, Ctrl2, PVP, and KP) that cluster in the lower right quartile of the plot is most pronounced for carrier-free (blue) followed by micellar encapsulated (KP, red) Ce4 and is least pronounced for PVP-encapsulated Ce4 (green). In analogy to the induced PLC-resonance shift discussed in chapter 3.3.4, the cell-metabolic response toward Ce4 treatment is clearly diminished by KP and even stronger by PVP-encapsulation. The easier release of Ce4 from the micellar KP carrier may be responsible for the difference observed with respect to PVP. Thus, the carriers probed here, particularly PVP, have a protective role leaving the PS inactive after cell internalization in the dark before light activation can trigger the desired cell damage. In addition, samples incubated with the carriers alone overlap with the control samples in both, the PCA (Figure 6) and PLS-DA (Figure 7). This indicates mild or no measurable metabolic cell response as anticipated for the pure carrier material alone.



**Figure 6.** (A) PCA applied to all samples and buckets from 1D PROJECT spectra (259 × 39). (B–D) Excerpts from the PCA plot in (A) for better visibility of the subclasses: (B) Samples without carriers; (C) Samples with KP as carrier; (D) Samples with PVP as carrier. (PCA model: RMSEC: 0.014, RMSECV: 0.02, number of PCs: 5).

Again, to disentangle the formulation related subgroups, the corresponding parts of the PLS-DA plot were extracted and shown separately in Figures 7 B, C, and D for better visibility of intra-group distributions. These excerpts clarify the correlation with Ce4 concentration within each subgroup that mainly had an impact on LV-2 scores. Both, for KP (Figure 7 C) and PVP (Figure 7 D) the LV-2 scores move from negative toward increasingly positive values with Ce4 concentration whereas the trend turns into an opposite direction for carrier-free samples (Figure 7 B). In Figure 7 E, the two-dimensional loading plot for LV-1 and LV-2 is shown. For classifying the impact of metabolite contributions to the PLS-DA model (Figure 7 A) according to their magnitude, 2 squares (light and dark gray) were overlaid marking the arbitrarily selected load values of  $\pm 0.1$  and  $\pm 0.2$  along both dimensions (Figure 7 E). According to this scale, Cho, PC and Cit have the largest impact on the separation of the sample classes with load values outside the “ $\pm 0.2$ -square”. This indicates that Cho levels are inversely correlated with concentration of free Ce4 (main contribution along LV-1) and Cit levels are correlated with concentration of carrier-associated Ce4 or moderately increased free Ce4, respectively, whereas PC levels decrease (main contributors along LV-2). The potential meaning of these metabolic changes will be further discussed in the subsequent sections.



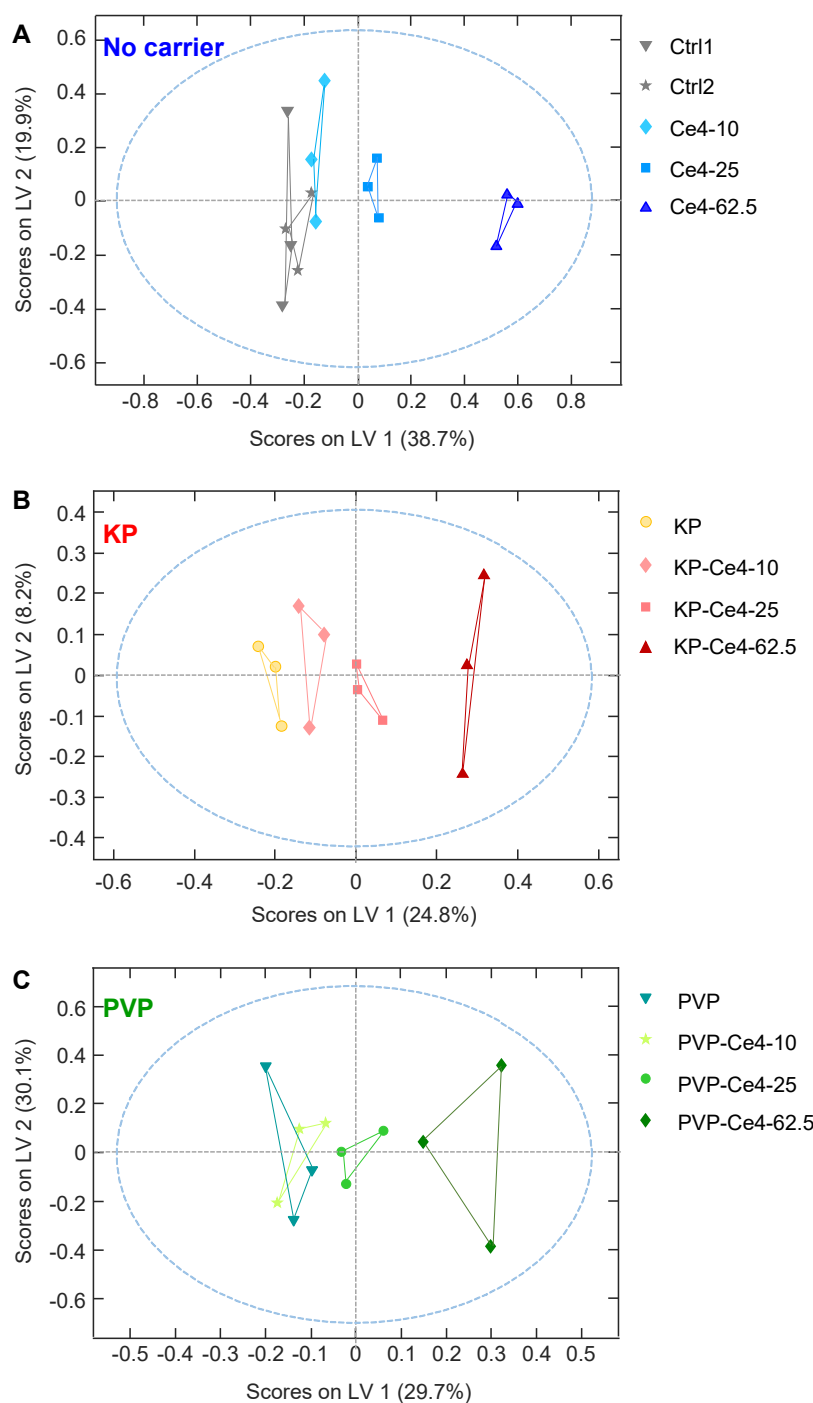
**Figure 7.** (A) PLS-DA applied to all samples and buckets from 1D PROJECT spectra (259 × 39). Excerpts from the PLS-DA plot in (A) for better visibility of the subclasses: (B) Samples without carriers; (C) Samples with KP as carrier; (D) Samples with PVP as carrier; (E) Loading Plot for LV-1 and LV-2; the squares mark the arbitrary regions of load values  $\pm 0.2$  and  $\pm 0.1$ . Model statistics are given in Table S1.

### 3.4.3. oPLS Analysis of subgroups

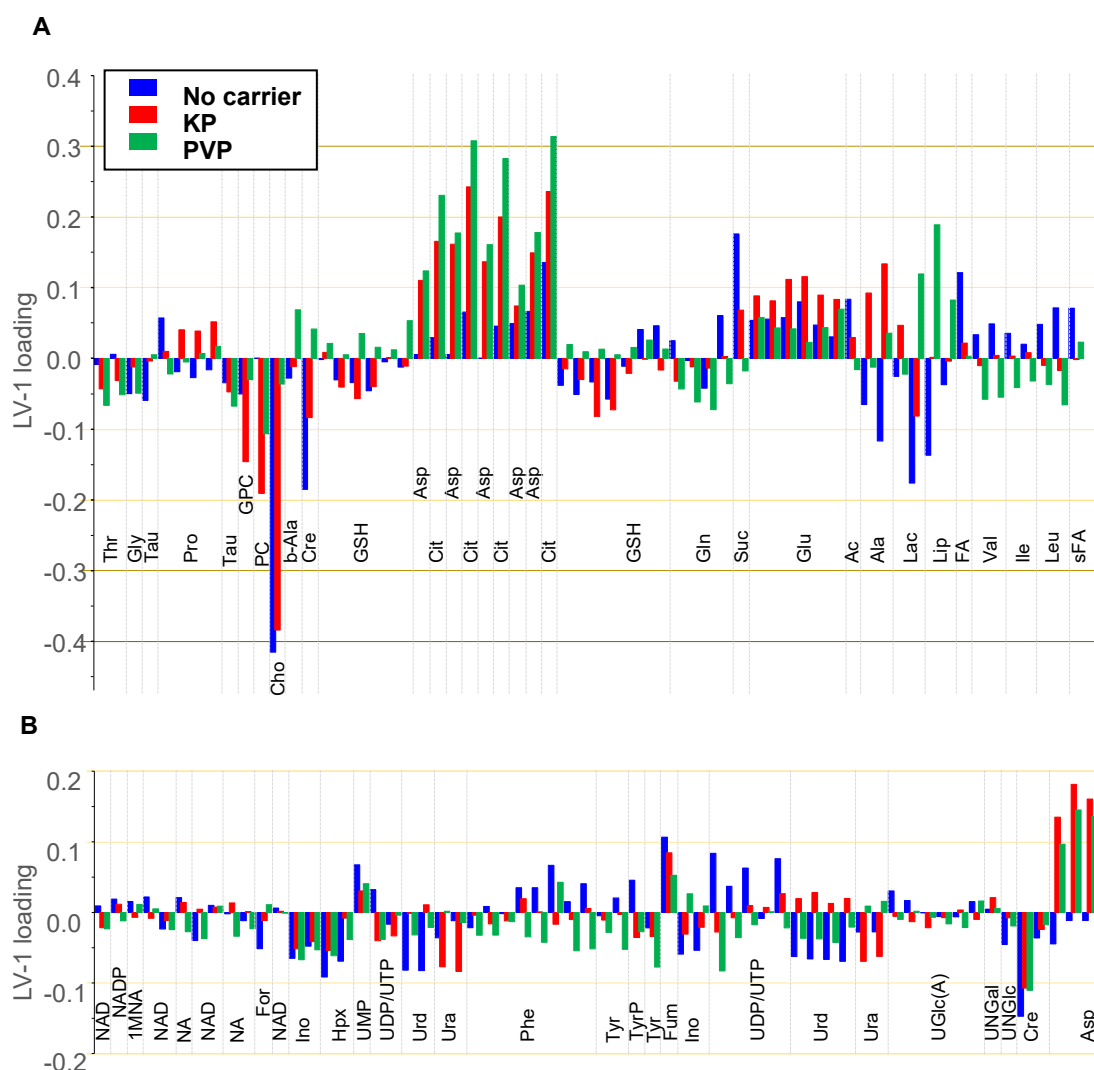
For separating the impact of formulation and concentration on the metabolic cell response, oPLS analysis was performed on each subgroup (no carrier, KP, PVP, Figure 8 A, B, and C, respectively). In the subgroups comprising cell samples exposed to KP- or PVP-encapsulated Ce4, the blank samples (no Ce4) were represented by cells exposed to the pure carrier KP and PVP, respectively, thus leaving the drug dose the only variable within each group. The linear regression model was chosen to correlate the metabolic response, i.e., the magnitude and direction of metabolite level changes, with Ce4 concentration. According to the oPLS plots shown in Figure 8, there is a clear dose-dependent trend along LV-1 common to all subgroups. The scores on LV-1 shift from negative values toward increasingly larger positive values with Ce4 concentration for all 3 subgroups. The corresponding loadings on LV-1 are displayed as bar plot in Figure 9 for the metabolites in the spectral region 0.8–3.6 ppm (Figure 9 A) and 3.6–9.4 ppm (Figure 9 B). Above all, Cho levels with a load value around -0.4 have the strongest contribution with a negative correlation on the concentration dependent discrimination of Ce4 treated samples, most pronounced for carrier-free, followed by KP-encapsulated Ce4 (Figure 9 A). However, the strong impact of Cho on the outcome of the Pareto-scaled PLS analysis is in part also due to its high concentration in the cells relative to the other metabolites as evidenced by the intense Cho resonance in the NMR spectrum (Figure 3). As opposed to unit variance scaling, Pareto scaling does not put equal weight onto each metabolite but only reduces the relative importance of dominant components keeping widely the proportions of spectral peak intensities [76]. While clearly giving rise to less intense resonances, Cit has a strong impact with load values around 0.3 on the discrimination of cells treated mainly with PVP- but also KP-associated Ce4. For the same groups, a clear positive correlation also exists with Asp levels (load values around 0.2). Among the metabolites with moderate contributions to the separation (+/- 0.1 – +/- 0.2) are PC and GPC with negative loadings mainly for Ce4-KP exposed samples. Moreover, decreased Cre levels correlate with Ce4 concentration, and also Lac and Ala have negative load values for carrier-free Ce4 treated samples. On the other hand, higher levels of Suc (free Ce4, Ce4-KP), Fum and Glu, as well as Lip (only for Ce4-PVP) correlate with increases in the drug dose.

Metabolic alterations within each subgroup (no carrier / KP / PVP) must be due to Ce4 concentration as the only independent variable. Differences between the subgroups must be related to Ce4-formulation. According to the PCA/PLS-DA (Figures. 6 and 7), the carrier material itself has only little impact on the cell metabolic response. Therefore, different metabolite oPLS loadings between the 3 subgroups may be explained as follows: (i) The formulation results in an overall lower actual intracellular Ce4 concentration range as shown in Figure 2; (ii) Due to restrained drug release from the carriers, different concentration ranges of free Ce4 may be present in the cell samples of each subgroup; (iii) The carriers may account for different intracellular drug localization sites possibly resulting from altered uptake and transport pathways of Ce4 into and inside the cell.



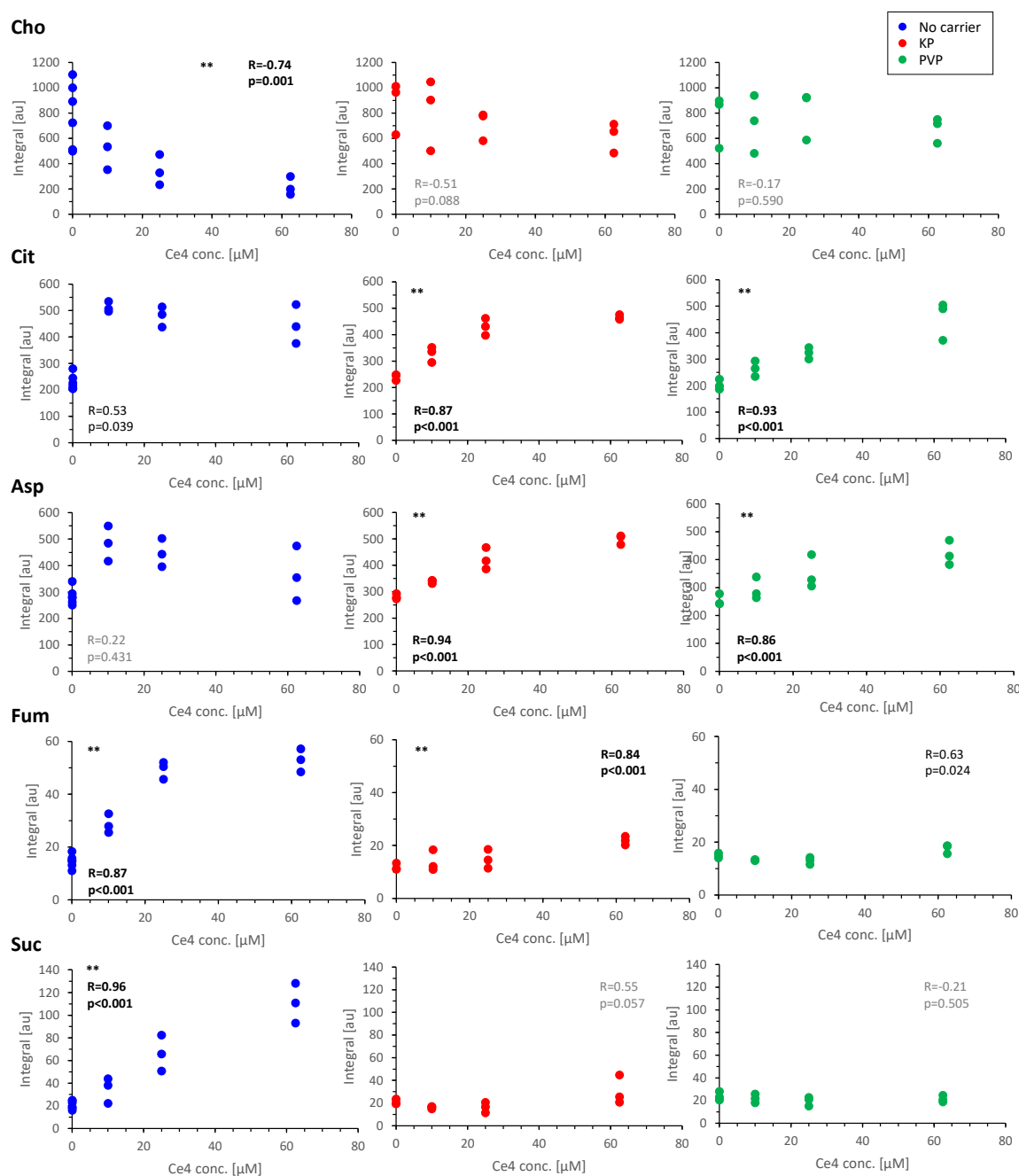


**Figure 8.** oPLS analysis applied to samples and buckets from 1D PROJECT spectra as X-matrix and Ce4 concentration (0, 10, 25, 62.5  $\mu$ M) as Y-matrix according to subclasses of (A) samples without carriers (259  $\times$  15); (B) samples with KP as carrier (259  $\times$  12); (C) samples with PVP as carrier (259  $\times$  12). The blue dashed line includes samples falling into the range of 95% confidence level. Model statistics: (A)  $R^2$  0.99;  $Q^2$  0.93; (B)  $R^2$  0.97;  $Q^2$  0.67; (C)  $R^2$  0.94;  $Q^2$  0.71.



**Figure 9.** Loadings of the first oPLS components (LV-1) according to the oPLS-score plots shown in Fig. 8 for carrier-free samples (blue), KP-samples (red), and PVP-samples (green). Loadings are shown for buckets that could be assigned to metabolites and that had little overlap. Horizontal arbitrary lines mark metabolites with respect to their contribution with load-values above  $\pm 0.1$ ,  $\pm 0.2$ ,  $\pm 0.3$  and  $\pm 0.4$ . (A) 3.6 – 0.8 ppm region; (B) 9.4 – 3.6 ppm region.

For validation, single metabolites were evaluated by a targeted approach applying correlation analysis to the corresponding representative buckets. For this, multiple buckets belonging to the same metabolite were merged to yield one value for each assigned metabolite. Plots for selected metabolites exhibiting significant level changes are shown in Figure 10. From these plots it becomes evident that the relative changes observed for Fum and Suc with a highly significant ( $p < 0.001$ ) increase are comparable to the decrease of Cho in Ce4 exposed cells in the absence of carriers (Figure 10). The rise in Fum levels is less pronounced but still significant for cells treated with Ce4-KP. Both, Cit and Asp levels almost doubled with high significance ( $p < 0.001$ ) when cells were treated with Ce4 in the presence of KP or PVP. When treated with free Ce4, Cit and Asp levels jumped to the double value already at the lowest Ce4 concentration and remained high with further Ce4 dose increase. In summary, 12 metabolites exhibited highly significant level changes with increasing Ce4 concentration without carriers including decreased Cre, Tau, Urd, and Hxn and increased FA, sFA, Ac, Leu, and UTP (Figure S7).



**Figure 10.** Plots of single metabolite integrals as function of Ce4 concentration applied without carrier (blue), with KP-micelles (red), and with PVP (green). Correlation analysis performed by fitting with resulting R-values and significance of correlation. Metabolites with highly significant ( $p < 0.001$ ) Ce4-concentration dependent levels are marked with \*\*.

Exposure to Ce4-KP and Ce4-PVP only yielded 4 (increased Cit, Asp, Fum, and Glu, Figure S7) and 2 (Cit, Asp) highly significant metabolite level changes with Ce4 concentration, respectively. In the first case (no carrier) cell uptake of relative high concentrations of free Ce4 seems to amount to a drug boost triggering a strong metabolic response whereas the overall lower uptake and delayed release from PVP rather reveals the subtle response to lower concentrations of free Ce4. The eased drug release from the micellar environment (KP) consequently causes an intermediate response, which is in accordance with the data presented in Figures 6–8. Finally, a simultaneous increase of Cit, Fum and Suc was exceptionally observed for samples exposed to carrier-free Ce4 (Figures 9 and 10). Since these metabolites are closely related to the tricarboxylic acid (TCA) cycle, the findings may point to an inhibitory primary or secondary toxic effect of free Ce4. The significant decrease in Cho

levels may be related to a preferred membrane localization of free Ce4, as suggested by the data shown in Figure 5. With an easier release from micelles (KP) compared to PVP, a considerable amount of Ce4 may also be present in the membrane upon delivery with KP explaining the slightly attenuated Cho decrease ( $p = 0.088$ , Figure 10) compared to carrier-free treatment.

### 3.4.4. Discussion of metabolic changes

#### Components of the phosphatidylcholine metabolism

##### *Cho, FAs, Cit, and Ac*

Cho, FAs, Cit and Ac are components that are involved in the phosphatidylcholine metabolism. Cho decrease and increase of Cit, FAs, sFAs and Ac particularly at high intracellular Ce4 concentrations indicate a perturbation of the pathways of FA and phospholipid synthesis or degradation [77]. Typically, the high cell proliferation of cancer cells is marked by elevated Cho and PC levels compared to healthy cells [78,79]. Consequently, the pronounced Cho decrease observed upon exposure to free Ce4 and Ce4-KP may indicate a downregulation of membrane synthesis and reduced cell proliferation. Such an effect has been reported for several antiproliferative drugs acting on the enzymatic activity involved in the biosynthesis of phospholipids [80,81]. However, in these studies, the Cho decrease is mostly accompanied by a PC decrease and GPC increase, which does not hold in the present work so that other mechanisms may be responsible. The reduced Cho levels may be related to the observed membrane localization shown in Figure 5. Both effects, PLC-upfield shift and Cho integral decrease, seem to correlate since they were each most pronounced with free Ce4 and least with PVP. Based on its high affinity for the Cho containing head groups of phospholipids (Figure 5), a direct interaction of Ce4 that bears two carboxylate groups with free cationic Cho is conceivable but would require further investigation. The higher Cit levels may originate from the inhibited TCA cycle and consequently exported mitochondrial Cit to the cytoplasm where it links to the FA synthesis.

#### Components of the TCA cycle

##### *Cit, Asp, Fum, and Suc*

Cit is a key compound of the TCA cycle and in the cytoplasm the link and starting point of FA synthesis. It is transported into the cytosol and cleaved yielding acetyl-CoA and oxaloacetate (OAA) for further anabolic utilization, like FA synthesis from acetyl-CoA. Cytosolic Cit concentrations are typically maintained low due to their rapid turnover [82]. The Ce4-concentration dependent increase in Cit levels indicates an imbalance that can be caused by both, enhanced Cit synthesis and enhanced mitochondrial release via the Cit carrier membrane protein [83], or reduced Cit consumption in the cytosol. OAA is – among others - also converted into Asp for nucleotide and polyamine synthesis. Since Cit and Asp levels were simultaneously increased in a Ce4-concentration dependent manner, it is likely that the same pathway of stimulated nutrient production (FA, nucleotides) is related to the metabolic response observed in this study.

Like Cit, both, Suc and Fum are TCA cycle intermediates that are closely related with Suc being directly converted to Fum via the enzyme succinate-dehydrogenase. While both metabolites are enhanced, the Suc increase is more pronounced (about 6-fold at highest Ce4-concentration) compared to 3-fold for Fum (Figure 10). Thus, enhanced Fum levels can be a result of Suc overproduction or due to an inhibition of Suc and Fum degradation, respectively. This may be caused by an imbalance in the TCA cycle enzymatic conversions. On the other hand, accumulation of Suc may also be a result of non-enzymatic formation via decarboxylation and oxidation of  $\alpha$ -ketoglutarate as response to oxidative stress reducing the level of ROS [84,85]. However, since the experiments were performed under strict exclusion of light, ROS production primarily caused by Ce4 is rather unlikely.

#### Nucleobases, nucleosides, nucleotides, and amines

Alterations in Cre and in the pyrimidine/purine derivatives Urd, UTP and Hxn reflect cellular adaptations in the nucleotide and energy metabolism in response to Ce4 exposure. It seems likely that the simultaneous Urd decrease and UTP increase are directly related to their enzymatic interconversion [86].



In summary, the metabolic alterations observed in HeLa cells exposed to different Ce4 concentrations can be interpreted as the stimulation of cellular defense mechanisms against the non-physiological porphyrinic invader (xenobiotic) to maintain the cellular metabolic state [87]. Since the cellular metabolic fingerprint obtained from the NMR spectrum represents a metabolic snapshot, the meaning of level changes in specific metabolites may be caused on either sides, accumulation or consumption. Nevertheless, altered level changes and their magnitudes indicate, which metabolic pathways are affected and are out of equilibrium. Notably, the polymeric carrier material, even though applied at much higher concentration than the PS, had only little or no detectable effects on the cell metabolism.

### 3.5. Limitations

Cell uptake pathways, intracellular fate as well as metabolic responses of PS-carrier systems may turn out differently depending on the cell type [15]. It will therefore be of interest in future studies if the observed metabolic alterations described here for HeLa cells will be similarly transferable to other cell lines. Further, the application of serum-free incubation media, a commonly applied method in metabolomic cell intervention studies [88], excludes the impact of proteins during cell uptake. However, serum-proteins may bind to the NP outer surface possibly resulting in modifications of the cell uptake and response. Finally, the complete exclusion of light may not be guaranteed at a 100% level so that subtle effects may be due to oxidative processes triggered by light. However, in the current experimental set-up, dead cells were excluded, and the different incubation media were all applied simultaneously under the same conditions. In addition, metabolic antioxidant cell defense mechanisms in response to oxidative stress mainly involve alterations in the GSH/GSSG and NAD/NADH or NADP/NADPH levels [89], which was not observed in the current study.

## 4. Conclusions

The current study reveals the impact of polymeric carriers like block copolymer micelles and PVP on the intracellular fate of a porphyrinic PS. The HR-MAS NMR approach applied to cells exposed to different PS concentrations with and without carriers has offered the unique possibility to trace both, the PS and the block copolymer inside the cell on a molecular and even atomic level. To our knowledge, this is the first time to detect intracellular sub-molecular PS membrane localization via ring current induced chemical shift perturbation of the phospholipid resonances. At the same time, examination of the small metabolite cell spectra and their multi- and univariate analyses indicated the metabolic response to the PS and carrier material under exclusion of light. Importantly also, the data revealed low toxicity of the carrier material based on the largely unchanged cell metabolic profile. The metabolic response to PS treatment was clearly attenuated when the PS was associated with KP-micelles and even more with PVP. This is an important aspect that may be extrapolated to other drugs that are likewise applied with comparable nano-platforms. In particular for porphyrinic PSs, it is crucial to keep any activity or correspondence with their cellular environment as low as possible during the dark incubation and accumulation period before the selective phototoxic reaction is triggered by light irradiation. In this sense, the carrier not only fulfills the task to protect the PS during its transport in the bloodstream and thus to enhance PS accumulation in the diseased tissue but also protects the intracellular environment from the PS. Thus, potential side effects and dark toxicity can be further lowered.

**Supplementary Materials:** The following supporting information can be downloaded at the website of this paper posted on Preprints.org, Figure S1: HR-MAS  $^1\text{H}$ -H-TOSY spectra of lysed HeLa cell suspension in PBS with resonance assignments, Figure S2: HR-MAS  $^1\text{H}$ -1D PROJECT,  $^1\text{H}$ -1D NOESY, and  $^1\text{H}$ -1D DOSY spectra of lysed HeLa cell suspension in PBS with resonance assignments of the 1D DOSY spectra, Figure S3: DOSY bi-exponential fitting curves, Figure S4: HR-MAS  $^1\text{H}$ -T<sub>2</sub>-edited and  $^1\text{H}$ -diffusion-edited spectra of 30 mM PVP in PBS, Figure S5: HR-MAS  $^1\text{H}$ -diffusion-edited spectra of HeLa-cells incubated with 30 mM PVP, with 30 mM KP and reference spectra of pure PVP and KP (30 mM in PBS), Figure S6: PCA scores plot displayed in Figure 6 with labelling of samples according to the three independently prepared cell batches (a, b, c) and loading plot for the principal components PC 1 and PC 2, Figure S7: Plots of single metabolite integrals as function of Ce4

concentration applied without carrier, with KP-micelles, and with PVP. Table S1: PLS-DA model statistics for individual sample classes.

**Author Contributions:** Conceptualization, M.V. and P.V.; methodology, P.V., M.V., J.-M.N.; software, P.V. and T.K.; validation, P.V. and T.K.; formal analysis, P.V., T.K., and M.V.; investigation, T.K.; resources, P.V., J.-M.N.; data curation, P.V. and M.V.; writing—original draft preparation, M.V.; writing—review and editing, T.K., P.V., and J.-M.N.; visualization, T.K., P.V. and M.V.; supervision, M.V., P.V. and J.-M.N.; project administration, M.V. and P.V.; funding acquisition, M.V. and P.V. All authors have read and agreed to the published version of the manuscript.

**Funding:** This research was funded by the Swiss National Science Foundation (grant no. 206021-128736 for the purchase of the HR-MAS probe, M.V., P.V.).

**Data Availability Statement:** The data presented in this study are available on request from the corresponding authors.

**Conflicts of Interest:** The authors declare no conflict of interest.

## Abbreviations

BCM, Block copolymer micelles; Ce4, Chlorin e4; Ce6, Chlorin e6; cmc, Critical micelle concentration; DMEM, Dulbecco's Modified Eagle's Medium; DOSY, Diffusion ordered spectroscopy; EPR, Enhanced permeability and retention; FCS, Fetal calf serum; HR-MAS, High Resolution Magic Angle Spinning; HSA, Human serum albumin; KP, Kolliphor P188; NOESY, Nuclear Overhauser Enhancement Spectroscopy; NP, Nanoparticle; OAA, Oxaloacetate; oPLS, orthogonal Partial least squares; P, Penicillin; PBS, Phosphate buffered saline; PCA, Principal component analysis; PDT, Photodynamic therapy; PEG, Polyethylene glycol; PES, Polyethersulfone; PLS-DA, Partial least squares discriminant analysis; PPG, Polypropylene glycol; PQN, Probabilistic quotient normalization; PROJECT, Periodic refocusing of J evolution by coherence transfer; PS, Photosensitizer; PVP, Polyvinylpyrrolidone; RMSEC, Root mean square error of calibration; RMSECV, Root mean square error of cross validation; ROS, Reactive oxygen species; S, Streptomycin; T/E, Trypsin-EDTA; TCA, Tricarboxylic acid; TOCSY, Total correlation spectroscopy

For metabolite abbreviations: See Table 2.

## References

1. Dąbrowski, J. M., Chapter Nine - Reactive Oxygen Species in Photodynamic Therapy: Mechanisms of Their Generation and Potentiation. In *Advances in Inorganic Chemistry*, van Eldik, R.; Hubbard, C. D., Eds. Academic Press: 2017; Vol. 70, pp 343-394.
2. Juzeniene, A., Chlorin e6-based photosensitizers for photodynamic therapy and photodiagnosis. *Photodiagnosis Photodyn Ther* **2009**, 6, (2), 94-96.
3. Abrahamse, H.; Hamblin, M.-R., New photosensitizers for photodynamic therapy. *Biochem J* **2016**, 473, (4), 347.
4. Ash, C.; Dubec, M.; Donne, K.; Bashford, T., Effect of wavelength and beam width on penetration in light-tissue interaction using computational methods. *Lasers Med Sci* **2017**, 32, (8), 1909-1918.
5. Baskaran, R.; Lee, J.; Yang, S.-G., Clinical development of photodynamic agents and therapeutic applications. *Biomater Res* **2018**, 22, 25-25.
6. Invion Limited: Photosoft granted patent protection in Australia. <http://chogroup.com.au/uncategorised/photosoft-granted-patent-protection-in-australia/> (17.09.2020),
7. Cho, H., RMW CHO Group Ltd: Chlorin Derivative Useful in Photodynamic Therapy and Diagnosis. Patent Hold number CN105008372B, China, 2015.
8. Conte, C.; Maiolino, S.; Pelloso, D. S.; Miro, A.; Ungaro, F.; Quaglia, F., Polymeric Nanoparticles for Cancer Photodynamic Therapy. In *Light-Responsive Nanostructured Systems for Applications in Nanomedicine*, Sortino, S., Ed. Springer International Publishing: Cham, 2016; pp 61-112.
9. Nie, S., Understanding and overcoming major barriers in cancer nanomedicine. *Nanomedicine (Lond)* **2010**, 5, (4), 523-528.
10. Li, S. D.; Huang, L., Nanoparticles Evading The Reticuloendothelial System: Role of The Supported Bilayer. *Biochim Biophys Acta* **2009**, 1788, (10), 2259-2266.
11. Maeda, H.; Nakamura, H.; Fang, J., The EPR effect for macromolecular drug delivery to solid tumors: Improvement of tumor uptake, lowering of systemic toxicity, and distinct tumor imaging in vivo. *Adv Drug Deliv Rev* **2013**, 65, (1), 71-79.
12. Pathak, Y. V., *Surface Modification of Nanoparticles for Targeted Drug Delivery*. Springer International Publishing: 2019; p 499.

13. Sahay, G.; Alakhova, D. Y.; Kabanov, A. V., Endocytosis of nanomedicines. *J Control Release* **2010**, 145, (3), 182-95.
14. Deng, J.; Gao, C., Recent advances in interactions of designed nanoparticles and cells with respect to cellular uptake, intracellular fate, degradation and cytotoxicity. *Nanotechnology* **2016**, 27, (41), 412002.
15. Behzadi, S.; Serpooshan, V.; Tao, W.; Hamaly, M. A.; Alkawareek, M. Y.; Dreaden, E. C.; Brown, D.; Alkilany, A. M.; Farokhzad, O. C.; Mahmoudi, M., Cellular uptake of nanoparticles: journey inside the cell. *Chem Soc Rev* **2017**, 46, (14), 4218-4244.
16. Foroozandeh, P.; Aziz, A. A., Insight into Cellular Uptake and Intracellular Trafficking of Nanoparticles. *Nanoscale Res Lett* **2018**, 13, (1), 339.
17. Franco, P.; De Marco, I., The Use of Poly(N-vinyl pyrrolidone) in the Delivery of Drugs: A Review. *Polymers (Basel)* **2020**, 12, (5), 1114.
18. Bailly, N.; Thomas, M.; Klumperman, B., Poly(N-vinylpyrrolidone)-block-poly(vinyl acetate) as a Drug Delivery Vehicle for Hydrophobic Drugs. *Biomacromolecules* **2012**, 13, (12), 4109-4117.
19. Kurakula, M.; Rao, G. S. N. K., Pharmaceutical assessment of polyvinylpyrrolidone (PVP): As excipient from conventional to controlled delivery systems with a spotlight on COVID-19 inhibition. *J Drug Deliv Sci Technol* **2020**, 60, 102046-102046.
20. Cabral, H.; Miyata, K.; Osada, K.; Kataoka, K., Block Copolymer Micelles in Nanomedicine Applications. *Chem Rev* **2018**, 118, (14), 6844-6892.
21. Raval, A.; Pillai, S. A.; Bahadur, A.; Bahadur, P., Systematic characterization of Pluronic- $\alpha$  micelles and their application for solubilization and in vitro release of some hydrophobic anticancer drugs. *J Mol Liq* **2017**, 230, (Supplement C), 473-481.
22. Liu, J.; Lee, H.; Allen, C., Formulation of Drugs in Block Copolymer Micelles: Drug Loading and Release. *Curr Pharm Des* **2006**, 12, (36), 4685-4701.
23. Demazeau, M.; Gibot, L.; Mingotaud, A.-F.; Vicendo, P.; Roux, C.; Lonetti, B., Rational design of block copolymer self-assemblies in photodynamic therapy. *Beilstein J Nanotechnol* **2020**, 11, 180-212.
24. Pellosi, D. S.; Tessaro, A. L.; Moret, F.; Gaio, E.; Reddi, E.; Caetano, W.; Quaglia, F.; Hioka, N., Pluronic- $\alpha$  mixed micelles as efficient nanocarriers for benzoporphyrin derivatives applied to photodynamic therapy in cancer cells. *J Photochem Photobiol A* **2016**, 314, (Supplement C), 143-154.
25. Chin, W. W. L.; Heng, P. W. S.; Thong, P. S. P.; Bhuvaneswari, R.; Hirt, W.; Kuenzel, S.; Soo, K. C.; Olivo, M., Improved formulation of photosensitizer chlorin e6 polyvinylpyrrolidone for fluorescence diagnostic imaging and photodynamic therapy of human cancer. *Eur J Pharm Biopharm* **2008**, 69, (3), 1083-1093.
26. Zhiyentayev, T. M.; Boltaev, U. T.; Solov'eva, A. B.; Aksenova, N. A.; Glagolev, N. N.; Chernjak, A. V.; Melik-Nubarov, N. S., Complexes of Chlorin e6 with Pluronics and Polyvinylpyrrolidone: Structure and Photodynamic Activity in Cell Culture. *Photochem Photobiol* **2014**, 90, (1), 171-182.
27. Pehlivan, E. G.; Ek, Y.; Topkaya, D.; Tazebay, U. H.; Dumoulin, F., Effect of PVP formulation on the in vitro photodynamic efficiency of a photosensitizing phthalocyanine. *J Porphyr Phthalocyanines* **2019**, 23, (11n12), 1587-1591.
28. Hädener, M.; Gjuroski, I.; Furrer, J.; Vermathen, M., Interactions of Polyvinylpyrrolidone with Chlorin e6-Based Photosensitizers Studied by NMR and Electronic Absorption Spectroscopy. *J Phys Chem B* **2015**, 119, (36), 12117-12128.
29. Gjuroski, I.; Furrer, J.; Vermathen, M., How Does the Encapsulation of Porphyrinic Photosensitizers into Polymer Matrices Affect Their Self-Association and Dynamic Properties? *ChemPhysChem* **2018**, 19, (9), 1089-1102.
30. Pfister, S.; Sauser, L.; Gjuroski, I.; Furrer, J.; Vermathen, M., Monitoring the encapsulation of chlorin e6 derivatives into polymer carriers by NMR spectroscopy. *J Porphyr Phthalocyanines* **2019**.
31. Gjuroski, I.; Girousi, E.; Meyer, C.; Hertig, D.; Stojkov, D.; Fux, M.; Schnidrig, N.; Bucher, J.; Pfister, S.; Sauser, L.; Simon, H.-U.; Vermathen, P.; Furrer, J.; Vermathen, M., Evaluation of polyvinylpyrrolidone and block copolymer micelle encapsulation of serine chlorin e6 and chlorin e4 on their reactivity towards albumin and transferrin and their cell uptake. *J Control Release* **2019**, 316, 150-167.
32. Schwarz, W. In *Pvp : A Critical Review of the Kinetics and Toxicology of Polyvinylpyrrolidone (Povidone)*, CRC Press, Boca Raton, 2018 (e-book), <https://doi.org/10.1201/9780203741672>.
33. Czekanska, E. M., Assessment of cell proliferation with resazurin-based fluorescent dye. *Methods Mol Biol* **2011**, 740, 27-32.
34. Kiesslich, T.; Gollmer, A.; Maisch, T.; Berneburg, M.; Plaetzer, K., A Comprehensive Tutorial on In Vitro Characterization of New Photosensitizers for Photodynamic Antitumor Therapy and Photodynamic Inactivation of Microorganisms. *Biomed Research International* **2013**, 2013, 1-17.
35. van Meerloo, J.; Kaspers, G. J. L.; Cloos, J., Cell Sensitivity Assays: The MTT Assay. In *Cancer Cell Culture: Methods and Protocols*, Cree, I. A., Ed. Humana Press: Totowa, NJ, 2011; pp 237-245.
36. Adjei, I. M.; Sharma, B.; Labhasetwar, V., Nanoparticles: Cellular Uptake and Cytotoxicity. In *Nanomaterial: Impacts on Cell Biology and Medicine*, Capco, D. G.; Chen, Y., Eds. Springer Netherlands: Dordrecht, 2014; pp 73-91.

37. Sztandera, K.; Gorzkiewicz, M.; Klajnert-Maculewicz, B., Nanocarriers in photodynamic therapy –in vitro and in vivo studies. *Wiley Interdiscip Rev Nanomed Nanobiotechnol* **2020**, 12, (3), e1509.
38. Lindon, J. C.; Beckonert, O. P.; Holmes, E.; Nicholson, J. K., High-resolution magic angle spinning NMR spectroscopy: Application to biomedical studies. *Prog Nucl Magn Reson Spectroscopy* **2009**, 55, (2), 79-100.
39. Griffin, J. L.; Bollard, M.; Nicholson, J. K.; Bhakoo, K., Spectral profiles of cultured neuronal and glial cells derived from HRMAS H-1 NMR spectroscopy. *NMR Biomed* **2002**, 15, (6), 375-384.
40. Kaebisch, E.; Fuss, T. L.; Vandergrift, L. A.; Toews, K.; Habbel, P.; Cheng, L. L., Applications of high-resolution magic angle spinning MRS in biomedical studies I–cell line and animal models. *NMR Biomed* **2017**, 30, (6), e3700-e3n/a.
41. Lv, M.; Huang, W.; Chen, Z.; Jiang, H.; Chen, J.; Tian, Y.; Zhang, Z.; Xu, F., Metabolomics techniques for nanotoxicity investigations. *Bioanalysis* **2015**, 7, (12), 1527-44.
42. Carrola, J.; Bastos, V.; Jarak, I.; Oliveira-Silva, R.; Malheiro, E.; Daniel-da-Silva, A. L.; Oliveira, H.; Santos, C.; Gil, A. M.; Duarte, I. F., Metabolomics of silver nanoparticles toxicity in HaCaT cells: structure-activity relationships and role of ionic silver and oxidative stress. *Nanotoxicology* **2016**, 10, (8), 1105-17.
43. Kumar Babele, P., Zinc oxide nanoparticles impose metabolic toxicity by de-regulating proteome and metabolome in *Saccharomyces cerevisiae*. *Toxicol Rep* **2019**, 6, 64-73.
44. Lindeque, J. Z.; Matthyser, A.; Mason, S.; Louw, R.; Taute, C. J. F., Metabolomics reveals the depletion of intracellular metabolites in HepG2 cells after treatment with gold nanoparticles. *Nanotoxicology* **2018**, 12, (3), 251-262.
45. Feng, J.; Li, J.; Wu, H.; Chen, Z., Metabolic responses of HeLa cells to silica nanoparticles by NMR-based metabolomic analyses. *Metabolomics* **2013**, 9, (4), 874-886.
46. Trivedi, A. B.; Kitabatake, N.; Doi, E., Toxicity of dimethyl sulfoxide as a solvent in bioassay system with HeLa cells evaluated colorimetrically with 3-(4,5-dimethylthiazol-2-yl)-2,5-diphenyl-tetrazolium bromide. *Agric Biol Chem* **1990**, 54, (11), 2961-6.
47. Jamalzadeh, L.; Ghafoori, H.; Sariri, R.; Rabuti, H.; Nasirzade, J.; Hasani, H.; Aghamaali, M. R., Cytotoxic Effects of Some Common Organic Solvents on MCF-7, RAW-264.7 and Human Umbilical Vein Endothelial Cells. *Avicenna J Med Biochem* **2016**, 4, (1), 10-33453.
48. Diserens, G.; Hertig, D.; Vermathen, M.; Legeza, B.; Fluck, C. E.; Nuoffer, J. M.; Vermathen, P., Metabolic stability of cells for extended metabolomic measurements using NMR. A comparison between lysed and additionally heat inactivated cells. *Analyst* **2017**, 142, (3), 465-471.
49. Aguilar, J. A.; Nilsson, M.; Bodenhausen, G.; Morris, G. A., Spin echo NMR spectra without J modulation. *ChemComm* **2012**, 48, (6), 811-813.
50. Wishart, D. S.; Jewison, T.; Guo, A. C.; Wilson, M.; Knox, C.; Liu, Y.; Djoumbou, Y.; Mandal, R.; Aziat, F.; Dong, E.; Bouatra, S.; Sinelnikov, I.; Arndt, D.; Xia, J.; Liu, P.; Yallou, F.; Bjorn Dahl, T.; Perez-Pineiro, R.; Eisner, R.; Allen, F.; Neveu, V.; Greiner, R.; Scalbert, A., HMDB 3.0 - The Human Metabolome Database in 2013. *Nucleic Acids Res* **2013**, 41, (D1), D801-D807.
51. Vermathen, M.; Paul, L. E. H.; Diserens, G. I.; Vermathen, P.; Furrer, J., <sup>1</sup>H HR-MAS NMR Based Metabolic Profiling of Cells in Response to Treatment with a Hexacationic Ruthenium Metallaprism as Potential Anticancer Drug. *Plos One* **2015**, 10, (5), e0128478.
52. Diserens, G.; Vermathen, M.; Gjuroski, I.; Eggimann, S.; Precht, C.; Boesch, C.; Vermathen, P., Direct determination of phosphate sugars in biological material by <sup>1</sup>H high-resolution magic-angle-spinning NMR spectroscopy. *Anal Bioanal Chem* **2016**, 408, (20), 5651-5656.
53. Vermathen, M.; von Tengg-Kobligk, H.; Hungerbühler, M. N.; Vermathen, P.; Ruprecht, N., <sup>1</sup>H HR-MAS NMR Based Metabolic Profiling of Lung Cancer Cells with Induced and De-Induced Cisplatin Resistance to Reveal Metabolic Resistance Adaptations. *Molecules* **2021**, 26, (22), 6766.
54. Shabalín, K.; Nerinovski, K.; Yakimov, A.; Kulikova, V.; Svetlova, M.; Solovjeva, L.; Khodorkovskiy, M.; Gambaryan, S.; Cunningham, R.; Migaud, M. E.; Ziegler, M.; Nikiforov, A., NAD Metabolome Analysis in Human Cells Using <sup>1</sup>H NMR Spectroscopy. *Int J Mol Sci* **2018**, 19, (12), 3906.
55. Dieterle, F.; Ross, A.; Schlotterbeck, G.; Senn, H., Probabilistic Quotient Normalization as Robust Method to Account for Dilution of Complex Biological Mixtures. Application in <sup>1</sup>H NMR Metabonomics. *Anal Chem* **2006**, 78, (13), 4281-4290.
56. Marin, A.; Muniruzzaman, M.; Rapoport, N., Mechanism of the ultrasonic activation of micellar drug delivery. *J Control Release* **2001**, 75, (1), 69-81.
57. Hatakeyama, H.; Akita, H.; Harashima, H., The polyethyleneglycol dilemma: advantage and disadvantage of PEGylation of liposomes for systemic genes and nucleic acids delivery to tumors. *Biol Pharm Bull* **2013**, 36, (6), 892-9.
58. Fang, Y.; Xue, J.; Gao, S.; Lu, A.; Yang, D.; Jiang, H.; He, Y.; Shi, K., Cleavable PEGylation: a strategy for overcoming the "PEG dilemma" in efficient drug delivery. *Drug Deliv* **2017**, 24, (sup1), 22-32.
59. Salmaso, S.; Caliceti, P., Stealth Properties to Improve Therapeutic Efficacy of Drug Nanocarriers. *J Drug Deliv* **2013**, 2013, 374252.



60. Heitzman, J. A.; Dobratz, T. C.; Fischer, K. D.; Townsend, D., A (1)H-NMR approach to myocardial energetics. *Sci Rep* **2020**, 10, (1), 17195.
61. Vermathen, M.; Vermathen, P.; Simonis, U.; Bigler, P., Time-Dependent Interactions of the Two Porphyrinic Compounds Chlorin e6 and Mono-L-aspartyl-chlorin e6 with Phospholipid Vesicles Probed by NMR Spectroscopy. *Langmuir* **2008**, 24, (21), 12521-12533.
62. Rocha, C. M.; Barros, A. S.; Gil, A. M.; Goodfellow, B. J.; Humpfer, E.; Spraul, M.; Carreira, I. M.; Melo, J. B.; Bernardo, J.; Gomes, A.; Sousa, V.; Carvalho, L.; Duarte, I. F., Metabolic Profiling of Human Lung Cancer Tissue by <sup>1</sup>H High Resolution Magic Angle Spinning (HRMAS) NMR Spectroscopy. *J Proteome Res* **2010**, 9, (1), 319-332.
63. Zietkowski, D.; Payne, G. S.; Nagy, E.; Mobberley, M. A.; Ryder, T. A.; deSouza, N. M., Comparison of NMR lipid profiles in mitotic arrest and apoptosis as indicators of paclitaxel resistance in cervical cell lines. *Magn Reson Med* **2012**, 68, (2), 369-77.
64. Sahay, G.; Batrakova, E. V.; Kabanov, A. V., Different internalization pathways of polymeric micelles and unimers and their effects on vesicular transport. *Bioconjug Chem* **2008**, 19, (10), 2023-9.
65. Nelemans, L. C.; Gurevich, L., Drug Delivery with Polymeric Nanocarriers-Cellular Uptake Mechanisms. *Materials (Basel)* **2020**, 13, (2), 366.
66. Penjweini, R.; Smisdom, N.; Deville, S.; Ameloot, M., Transport and accumulation of PVP-Hypericin in cancer and normal cells characterized by image correlation spectroscopy techniques. *Biochim Biophys Acta* **2014**, 1843, (5), 855-65.
67. Luss, A. L.; Kulikov, P. P.; Romme, S. B.; Andersen, C. L.; Pennisi, C. P.; Docea, A. O.; Kuskov, A. N.; Velonia, K.; Mezhev, Y. O.; Shtilman, M. I.; Tsatsakis, A. M.; Gurevich, L., Nanosized carriers based on amphiphilic poly-N-vinyl-2-pyrrolidone for intranuclear drug delivery. *Nanomedicine (Lond)* **2018**, 13, (7), 703-715.
68. Kulikov, P. P.; Luss, A. L.; Nelemans, L. C.; Shtilman, M. I.; Mezhev, Y. O.; Kuznetsov, I. A.; Sizova, O. Y.; Christiansen, G.; Pennisi, C. P.; Gurevich, L., Synthesis, Self-Assembly and In Vitro Cellular Uptake Kinetics of Nanosized Drug Carriers Based on Aggregates of Amphiphilic Oligomers of N-Vinyl-2-pyrrolidone. *Materials (Basel)* **2021**, 14, (20), 5977.
69. Abraham, R. J.; Fell, S. C. M.; Smith, K. M., The n.m.r. spectra of porphyrins. 13—A ring current model for the porphyrin and chlorin (7,8-dihydroporphyrin) rings. *Org Magn Reson* **1977**, 9, (6), 367-373.
70. Gjuroski, I.; Furrer, J.; Vermathen, M., Probing the Interactions of Porphyrins with Macromolecules Using NMR Spectroscopy Techniques. *Molecules* **2021**, 26, (7), 1942.
71. Moreira, L. M.; dos Santos, F. V.; Lyon, J. P.; Maftoum-Costa, M.; Pacheco-Soares, C.; da Silva, N. S., Photodynamic therapy: Porphyrins and phthalocyanines as Photosensitizers. *Aust J Chem* **2008**, 61, (10), 741-754.
72. Moan, J.; Berg, K.; Kvam, E.; Western, A.; Malik, Z.; Rück, A.; Schneckenburger, H., Intracellular Localization of Photosensitizers. In *Ciba Foundation Symposium 146 - Photosensitizing Compounds: Their Chemistry, Biology and Clinical Use*, 2007; pp 95-111.
73. Vermathen, M.; Marzorati, M.; Vermathen, P.; Bigler, P., pH-Dependent Distribution of Chlorin e6 Derivatives across Phospholipid Bilayers Probed by NMR Spectroscopy. *Langmuir* **2010**, 26, (13), 11085-11094.
74. Marzorati, M.; Bigler, P.; Vermathen, M., Interactions between selected photosensitizers and model membranes: an NMR classification. *Biochim Biophys Acta Biomembr* **2011**, 1808, (6), 1661-1672.
75. Fages, A.; Pontoizeau, C.; Jobard, E.; Lévy, P.; Bartosch, B.; Elena-Herrmann, B., Batch profiling calibration for robust NMR metabolomic data analysis. *Anal Bioanal Chem* **2013**, 405, (27), 8819-27.
76. van den Berg, R. A.; Hoefsloot, H. C.; Westerhuis, J. A.; Smilde, A. K.; van der Werf, M. J., Centering, scaling, and transformations: improving the biological information content of metabolomics data. *BMC Genomics* **2006**, 7, 142.
77. Saito, R. d. F.; Andrade, L. N. d. S.; Bustos, S. O.; Chammas, R., Phosphatidylcholine-Derived Lipid Mediators: The Crosstalk Between Cancer Cells and Immune Cells. *Front Immunol* **2022**, 13.
78. Ackerstaff, E.; Glunde, K.; Bhujwalla, Z. M., Choline phospholipid metabolism: a target in cancer cells? *J Cell Biochem* **2003**, 90, (3), 525-33.
79. Glunde, K.; Ackerstaff, E.; Mori, N.; Jacobs, M. A.; Bhujwalla, Z. M., Choline Phospholipid Metabolism in Cancer: Consequences for Molecular Pharmaceutical Interventions. *Mol Pharmaceutics* **2006**, 3, (5), 496-506.
80. Hernández-Alcoceba, R.; Saniger, L.; Campos, J.; Núñez, M. C.; Khaless, F.; Gallo, M. A.; Espinosa, A.; Lacal, J. C., Choline kinase inhibitors as a novel approach for antiproliferative drug design. *Oncogene* **1997**, 15, (19), 2289-301.
81. Cheng, M.; Bhujwalla, Z. M.; Glunde, K., Targeting Phospholipid Metabolism in Cancer. *Front Oncol* **2016**, 6, 266.
82. Icard, P.; Coquerel, A.; Wu, Z.; Gligorov, J.; Fuks, D.; Fournel, L.; Lincet, H.; Simula, L., Understanding the Central Role of Citrate in the Metabolism of Cancer Cells and Tumors: An Update. *Int J Mol Sci* **2021**, 22, (12).



83. Zara, V.; Assalve, G.; Ferramosca, A., Multiple roles played by the mitochondrial citrate carrier in cellular metabolism and physiology. *Cell Mol Life Sci* **2022**, 79, (8), 428.
84. Fedotcheva, N. I.; Sokolov, A. P.; Kondrashova, M. N., Nonezymatic formation of succinate in mitochondria under oxidative stress. *Free Radic Biol Med* **2006**, 41, (1), 56-64.
85. Tretter, L.; Patocs, A.; Chinopoulos, C., Succinate, an intermediate in metabolism, signal transduction, ROS, hypoxia, and tumorigenesis. *Biochim Biophys Acta - Bioenerg* **2016**, 1857, (8), 1086-1101.
86. Zhang, Y.; Guo, S.; Xie, C.; Fang, J., Uridine Metabolism and Its Role in Glucose, Lipid, and Amino Acid Homeostasis. *Biomed Res Int* **2020**, 2020, 7091718.
87. Balcerczyk, A.; Damblon, C.; Elena-Herrmann, B.; Panthu, B.; Rautureau, G. J. P., Metabolomic Approaches to Study Chemical Exposure-Related Metabolism Alterations in Mammalian Cell Cultures. *Int J Mol Sci* **2020**, 21, (18).
88. Rashid, M. U.; Coombs, K. M., Serum-reduced media impacts on cell viability and protein expression in human lung epithelial cells. *J Cell Physiol* **2019**, 234, (6), 7718-7724.
89. Rusz, M.; Del Favero, G.; El Abiead, Y.; Gerner, C.; Keppler, B. K.; Jakupiec, M. A.; Koellensperger, G., Morpho-metabotyping the oxidative stress response. *Sci Rep* **2021**, 11, (1), 15471.

**Disclaimer/Publisher's Note:** The statements, opinions and data contained in all publications are solely those of the individual author(s) and contributor(s) and not of MDPI and/or the editor(s). MDPI and/or the editor(s) disclaim responsibility for any injury to people or property resulting from any ideas, methods, instructions or products referred to in the content.