

Application of integrated transcriptomic, proteomic and metabolomic profiling for the delineation of mechanisms of drug induced cell stress

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ABSTRACT

High content omic techniques in combination with stable human *in vitro* cell culture systems have the potential to improve on current pre-clinical safety regimes by providing detailed mechanistic information of altered cellular processes. Here we investigated the added benefit of integrating transcriptomics, proteomics and metabolomics together with pharmacokinetics for drug testing regimes.

Cultured human renal epithelial cells (RPTEC/TERT1) were exposed to the nephrotoxin Cyclosporine A (CsA) at therapeutic and supratherapeutic concentrations for 14 days. CsA was quantified in supernatants and cellular lysates by LC–MS/MS for kinetic modeling. There was a rapid cellular uptake and accumulation of CsA, with a non-linear relationship between intracellular and applied concentrations. CsA at 15 μ M induced mitochondrial disturbances and activation of the Nrf2-oxidative-damage and the unfolded protein-response pathways. All three omic streams provided

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1874-3919 © 2012 Elsevier B.V. Open access under CC BY-NC-ND license. http://dx.doi.org/10.1016/j.jprot.2012.11.022 complementary information, especially pertaining to Nrf2 and ATF4 activation. No stress induction was detected with 5 μ M CsA; however, both concentrations resulted in a maximal secretion of cyclophilin B.

The study demonstrates for the first time that CsA-induced stress is not directly linked to its primary pharmacology. In addition we demonstrate the power of integrated omics for the elucidation of signaling cascades brought about by compound induced cell stress.

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1. Introduction

Failures of lead candidates in the late phases of pharmaceutical development are costly, both in terms of time and money and thus seriously hinder the number of compounds reaching the market. Compounds are dropped late in development, due to a lack of efficacy or to unexpected adverse effects that were not identified by animal test batteries. The EU 7th Framework project, Predict-IV, was established in order to develop mechanistic strategies for predictive toxicology. We are pursuing three avenues simultaneously in an attempt to improve pre-clinical safety test systems by: (i) focusing on cells of human origin, (ii) conducting in-depth characterization of molecular perturbations with complimentary omic technologies and (iii) determining the actual compound exposure through pharmacokinetic modeling.

Developments in cell culture techniques such as the availability of hormonally defined media together with recent advances in immortalization including stable expression of the catalytic subunit of human telomerase have led to the generation of improved cell lines such as the human renal proximal tubular cell line, RPTEC/TERT1 [1]. However, cell cultures have not yet reached their full potential as a tool for toxicological investigations, as they have been mostly used in conjunction with cytotoxicity end-points providing little mechanistic information. Molecular analysis of cellular processes in response to compound exposure would better harness the potential of in vitro systems. Recent technological advancements allow the possibility of a holistic, mechanistic approach to in vitro toxicology and promise to further our understanding of how cells deal with stress.

Omic-profiling-techniques have proven to be powerful new tools for unraveling complex biological processes and have been successfully utilized in the fields of microbiology, fungal, plant and human biology [2-5]. Transcriptomic (TCX) studies cover the entire human genome and are well established. TCX has been used in many in vitro and in vivo studies [6–9]. However, gene expression alone does not provide information on alternative splicing, PTM or even protein expression itself. Proteomics (PTX) offers the possibility to directly study the expressed protein, including isoforms and PTMs. However, it is not yet possible to study the entire proteome and factors such as protein abundance level, pI and solubility, come into play. Thus the number of proteins detected is dependent on the protocols employed for isolation, enrichment and separation. Metabolomics (MTX) provides a snapshot of the metabolic environment that is the consequence of the transcriptome, proteome and nutritional environment. Both PTX and MTX are

now beginning to be utilized in toxicological and pharmacological settings [10,11]. The integration of these three omic technologies has the potential to give a much more detailed view of cellular homeostasis than when used individually [12]. In addition, for a correct interpretation of toxicological data, it is critical to have information on the cellular handling of the applied compound. This can be approached using pharmacokinetic modeling [13].

The major aim of this study was to investigate the benefit of integrating omic data streams with pharmacokinetics for use in *in vitro* toxicology and safety assessment. We show, under our experimental settings, that this approach provided a global picture of compound-induced stress and could clearly distinguish pharmacological from toxicological effects.

2. Materials and methods

Chemicals were purchased from Sigma Aldrich, unless otherwise stated.

2.1. Cell culture

RPTEC/TERT1 [1] cells were obtained from Evercyte GmbH, Vienna and cultured in a 1 to 1 mixture of DMEM and Ham's F-12 nutrient mix (Invitrogen) supplemented with 2 mM glutamax (Invitrogen), 5 μ g/ml insulin, 5 μ g/ml transferrin and 5 ng/ml sodium selenite, 100 U/ml penicillin and 100 μ g/ml streptomycin, 10 ng/ml epithelial growth factor and 36 ng/ml hydrocortisone.

2.2. Cell treatment and sample preparation

RPTEC/TERT1 cells were cultured on 0.2 µm pore size, 25 mm diameter aluminum oxide filters (Nunc), with 1 ml apical and 2 ml basolateral medium. CsA (Calbiochem, purity 97%) was dissolved in DMSO and further diluted in culture medium to 5 and 15 µM. DMSO concentration was 0.1% in both CsA medium and control medium. After a 10 day stabilization phase, cells were treated with CsA every day for up to 14 days. Cells were harvested at days 1, 3 and 14 for TCX, PTX, and MTX (Fig. 1a). Additionally, supernatant was collected daily for MTX and CsA was measured in supernatants, cell lysates and on cell culture walls (Fig. 1a). RNA was extracted using the RNeasy Mini Kit (QIAGEN). For PTX, MTX and kinetics ice cold 100% methanol was used as a quenching and lysing reagent. For MS MTX cells were washed in ammonia bicarbonate (185 mM, pH 7.8) prior to lysing. CsA bound to cell culture wells was removed with 100% methanol.



Fig. 1 – Experimental layout and effects of treatment on monitoring endpoints. (a) Scheme of experimental procedure and sample generation. RPTEC/TERT1 cells, cultured on microporous supports, were stabilized for 10 days and treated with CsA. Samples were harvested at set intervals as indicated. Transepithelial electrical resistance (TEER) (b) and lactate (c) were measured daily. Values represent the mean±SEM of three biological replicates. *Denotes a significant difference (0.05) from controls using repeated measures two-way ANOVA with a Bonferroni's multiple comparisons post test.

2.3. Monitoring endpoints

Transepithelial electrical resistance (TEER) was measured using the Endohm and EVOM systems from World Precision Instruments. Supernatant lactate was quantified using a biochemical assay [14]. Statistical analysis was performed using a two-way ANOVA with a Bonferroni's multiple comparisons post test (n=3).

2.4. Omic and CsA quantification procedures

TCX was conducted with Illumina® HT 12 v3 BeadChip arrays (~47,000 transcripts). Peptides for PTX were labeled with iTRAQ and measured with HPLC-MS. The HPLC system was directly coupled to a linear ion-trap Orbitrap mass spectrometer (LTQ Orbitrap XL, ThermoFisher Scientific) with a nanoelectrospray ionization source operated in positive ionization mode. MS MTX profiling of cell lysates was also conducted with Orbitrap MS with direct infusion. ¹H NMR spectra from cell lysates were recorded at 600.13 MHz on a Bruker DMX 600 Spectrometer equipped with a 5 mm DCH cryoprobe at 303 K. Supernatant medium was analyzed by LC–MS, where separation was performed on an Ultimate 3000 liquid chromatography system (Dionex) followed by on-line analysis with an Orbitrap mass spectrometer. CsA was quantified by LC–MS/MS using a calibration curve with a linear range between 10 nM and 2000 nM.

Detailed procedures are given in the Supplementary Methods.

2.5. Western blot analysis

For cyclophilin B blots, methanol extracts were evaporated and resuspended in 30 mM Tris–HCl, 7 M urea, 2 M thiourea and 4% (w/v) CHAPS, pH 8.5. Cell lysates (5 μ g) and supernatants (16 μ l) were loaded. In order to study the nuclear and the cytosolic fraction RPTEC/TERT1 cells cultured in 12 well plates were treated every day for up to 14 days with 5 and 15 μ M CsA and with 5 μ M of the Nrf2 activator AI1. Cells were lysed and nuclear and cytosolic fractions were prepared as previously described [6]. Samples (10 to 20 μ g) were separated on a 4–12% gradient Nu-Page Bis-Tris SDS-PAGE gel and transferred to PVDF membranes. Antibody sources and dilutions are given in the Supplementary Methods.

2.6. Data warehousing, data analysis and statistics

Collection and warehousing of omic data were performed using BASE (Emergentec Biodevelopment GmbH, www. emergentec.com). Identification of deregulated TCX probes was carried out using a moderated one-way ANOVA to reduce the set of relevant probes to those that exhibit a significant change under any condition with a Benjamini–Hochberg corrected p-value below or equal to 0.05. On the remaining probes, a moderated two-sided t-test was calculated and corrected via Benjamini–Hochberg. For both steps, the R package "limma" was used. Pathway and transcription factor enrichment was conducted with Ingenuity Pathway Analysis (IPA®, www.ingenuity.com/), using a fold cutoff of 1.5 and p-value of 0.001. Heat maps were generated with Treeview (rana.lbl.gov/EisenSoftware). Principal component analysis (PCA) plots were generated using prcomp in the R package "stats".

Protein identification and quantification workflow were implemented in OpenMS (version 1.9) [15] and TOPPAS [16]. Statistical analysis was performed using the isobar package [17] and custom R code. For additional details see the Supplementary Methods.

The software package BRB-ArrayTools was used to identify significantly altered features in the supernatant MTX data [18]. A class comparison with less than 0.001 p-value and 2 fold alteration from treated to time matched control was used.

2.7. Pharmacokinetic analysis

To analyze the *in vitro* pharmacokinetic CsA data, we developed a 3-compartment model of CsA exchange between supernatant, cells and vial wall (Fig. 5a). CsA could distribute inside the cells, attach to the plastic vial walls and be metabolized. Several mathematical forms for exchange rates were tested: the best fit was obtained using a first order entry into cells with Michaelis–Menten (saturable) exit rate, a first order attachment to vial wall with non-integer (fractal) order detachment, and Michaelis–Menten metabolism. For further details see the Supplementary Methods.

3. Results

We aimed to investigate the effects of repeated exposure of Cyclosporine A (CsA) at concentrations where no major cellular perturbations are observed (upper therapeutic index) and where severe perturbations are observed, but in the absence of cell death. Previous experiences demonstrated that a 14 day repeated dose regime of 5 and 15 μ M would fit these criteria [14]. TEER and lactate production were monitored through-out the experiment as parameters of monolayer integrity and cell stress, respectively [14,19]. We observed an early increase in TEER with 15 µM CsA that was significantly elevated at day 7 and this elevation was maintained until day 14 (Fig. 1b). Such an effect has been previously documented [20] and is thought to be due to alterations in claudin expression. In our TCX data, we have also observed such changes. There was no significant impact of 5 µM CsA on TEER over the 14 days. Lactate production was unaltered by 5 µM CsA but was significantly elevated by 15 μM CsA, starting at day 1 (Fig. 1c). Thus, two independent parameters demonstrated a major perturbation of cellular function with 15 μ M CsA in the absence of significant toxicity.

3.1. TCX alterations

Apart from one gene (the chloride channel, CLCNKA, d1 vs d14), there were no time-dependent alterations in the control samples. This illustrates the stability of the model over the treatment period. CsA at 5 μ M had no significant impact on the transcriptome. For 15 μ M CsA, there were 3314, 3968 and 1337 probes differently expressed at 1, 3 and 14 days, respectively. PCA confirmed these observations (Fig. 2a). The highest transcriptomic impact was observed after 3 days, while 14 days had the least impact. Pathway analysis, using IPA® identified protein ubiquitination, Nrf2-mediated-oxidative-stress response, glutathione metabolism and aminoacyl-tRNA biosynthesis as major hubs (Fig. 2b). Transcription factor enrichment analysis showed a predominance of Nrf2, XBP1 and ATF4 activation at all time points (Fig. 2c). Individual gene changes from these pathways are depicted in Fig. 2d as heat maps.

There was a clear activation of all three branches of the *unfolded protein response* (UPR) with 15 μ M CsA. Genes that have been well characterized from the PERK/ATF4 branch include those involved in amino acid synthesis, amino acid transport (including SLC7A5 and 11) and aminoacyl-tRNA synthesis (Fig. 2d). There was also a clear activation of the UPR-ATF6-branch with induction of HSPA5, XBP1 HSP90B1, DDIT3 and WFS1. The UPR IRE1 branch/XBP1 was also activated, including induction of SERP-1, and the DnaJ (Hsp40) homologs DNAJB11 and DNAJB9.

Nrf2-oxidative-stress-pathway was induced by 15 μ M CsA. Nrf2-dependent genes induced at all time points include genes involved in glutathione synthesis (GCLM and GCLC), glutathione recycling (GSR), genes with an anti-oxidant role (SRXN1, TXN, TXNRD1, SOD1) and iron storage (FTH1) (Fig. 2d). NQO1 and heme oxygenase 1 (HMOX1, aka HO1) were induced at the early time points. Additionally, ATF4 mRNA, which is under the transcriptional regulation of Nrf2 [21] was increased.

CsA caused a robust alteration in genes involved in protein degradation (Fig. 2d). These include those involved in (i) chaperone activity (DnaJ (Hsp40) homologs and heat shock protein (HSP) family), (ii) ubiquitination (ubiquitinconjugating enzymes (UBE) and ubiquitin specific peptidases (USP)), (iii) proteasome activity (proteasome (prosome, macropain) subunits (PSM)) and (iv) lysosomal activity (PSAP and CTSD).

CsA (15 μ M) also resulted in an alteration of genes involved in glycolysis and the p53 pathway. These included the induction of hexokinase 2 (HK2), enolase 2 (ENO2), CDKN1A (aka p21) and growth arrest and DNA-damage-inducible, alpha (GADD45A).

Members of the peptidylprolyl isomerase family (PPI), better known as cyclophilins (CyP), were also altered in the TCX data by 15 μ M CsA (Fig. 2d). The cytosolic isoform CyP-C (aka PPIC) was decreased on all days. The mitochondrial CyP-D (encoded by PPIF) and CyP-G (aka PPIG) were increased at day 3 and CyP-H (aka PPIH) was decreased at day 1.

3.2. PTX alterations induced by CsA

A total of 218 out of 2642 proteins detected, of which 599 were detected in every condition, were significantly altered by 15 μ M CsA. PCA shows a strong separation of both concentrations (Fig. 3a). The fold expression levels of 15 μ M CsA-altered proteins were correlated to their respective mRNA values at each time point (Fig. 3b). Day 1 had the poorest correlation that improved considerably with time. However, for certain proteins there was no correlation or an inverse correlation to the



Fig. 2 – Effects of CsA exposure on RPTEC/TERT1 transcriptome. (a) Principal component analysis (PCA) of all probes from the 27 arrays. (b) IPA® summary of enriched canonical pathways. The ratio is the number of identified molecules divided by the number of molecules in the pathway. (c) IPA® prediction of transcription factor (TF) involvement. The p-value is calculated with Fisher's exact test. The z-score predicts TF state, where z>2 is significantly activated. * Log ratio is given where the transcript itself was deregulated. (d) The actual values (log 2 fold control) are shown as a heat map, where red represents increased expression and green decreased expression.



Fig. 3 – Effects of CsA exposure on RPTEC/TERT1 proteome. (a) PCA of all 599 proteins detected in every sample. (b) Correlation of CsA-induced protein alterations with corresponding mRNA levels. Red and green dots represent a good correlation of increased or decreased molecules, respectively. Blue dots show a poor correlation between mRNA and protein. (c) Heat map and functional grouping of proteins, with green indicating a decrease and red indicating an increase in protein abundance over control values. The mRNA DE (differentially expressed) column reports whether the corresponding mRNA was significantly deregulated.

transcript level. For example, PIGQ and TIGAR were marginally altered at the mRNA level but increased at the protein level (Fig. 3b), whereas PPP1CA was increased at the protein level but exhibited a decreased transcript level. Additionally, the fatty acid transporter SLC25A18, and CyP-B (aka PPIB) were only altered at the protein level. Examples of good correlations

between mRNA and protein levels include the decreased molecules butyrobetaine (gamma), 2-oxoglutarate dioxygenase (BBOX1) and ATPase, ATP6V1B1 and the increased molecules MLLT11 and HSPA1A, and SRXN1.

Functional evaluation of the proteins altered by 15 μ M CsA demonstrated a dominance of oxidative stress response, mitochondrial dysfunction and protein degradation, which overlaps with the TCX data (Fig. 3c). In the ATF4 pathway, PPP1CA, ASNS, GARS, IARS and YARS were all induced. Additionally, there were alterations in chaperone proteins and proteins involved in translation. For the Nrf2 pathway, proteins including FTH1, SRXN1, GCLM and GLRX3 were elevated at one or more time points. Additionally, proteins known to be attenuated by Nrf2 activation were decreased, for example SOD3 [22]. A number of proteins not directly linked to Nrf2 but known to be altered by oxidative stress were also impacted here including, biliverdin reductase B (BLVRB) and oxidation resistance 1 (OXR1). Proteins associated with the mitochondria were also altered, including a decrease in cytochrome C oxidase (1 and 2) and an increase in MINOS-1 and MLLT11 (aka Af1q). The latter protein is thought to be involved in the regulation of mitochondrial membrane potential [23]. Proteins that are associated with ubiquitination, proteasome activation (PSMs) and lysosomal activity (including cathepsin D, CTSD) were induced (Fig. 3c). Proteins involved in protein synthesis and energy metabolism were also altered. Fatty acid metabolism was suppressed, for example, BBOX1 and the long chain fatty acid transporter SLC27A4 were decreased. Proteins involved in glycolysis were increased including, ENO2, HK2 and phosphofructokinase P (PFKP).

CyP-D was increased at days 3 and 14 (Fig. 3c). Interestingly, CyP-B was the only protein consistently attenuated by both CsA concentrations at all time points.

3.3. MTX alterations

3.3.1. Extracellular

PCA demonstrated a high impact of $15 \,\mu$ M CsA and a negligible effect of $5 \,\mu$ M on the metabolic profile in supernatant medium (Fig. 4a). The $15 \,\mu$ M samples demonstrated a time-dependent clustering pattern. There were 192 significant features with over 2 fold alteration at any day (Fig. 4b). At the present time deeper biological insights of the MTX supernatant data cannot be provided as the data set remains un-annotated.

3.3.2. Cellular

CsA (15 μ M) had a considerable impact on cellular metabolites. Gamma-glutamylcysteine (γ -GC) was the most increased metabolite with an 80-fold induction at day 3 (Fig. 4c). Glutathione (GSH), glutathione disulfide (GSSG) and cysteine glutathione disulfide (CYSSG) were also heavily induced, demonstrating an induction of glutathione synthesis, recycling and oxidation. The amino acids L-alanine, L-arginine, L-leucine, L-tryptophan, L-valine and L-isoleucine were increased, while L-aspartate, L-threonine and L-glutamate were decreased. Fumarate was decreased while citrate and NADH were elevated. The nucleoside monophosphate sugar cytidine monophosphate N-acetylneuraminic acid (CMP-NeuNAc) was increased. CMP-NeuNAc is involved in glycosylation, specifically sialic acid addition, and its induction was paralleled by an increase in the mRNA for cytidine monophosphate N-acetylneuraminic acid synthetase (CMAS). Sphingomyelin was decreased while phosphatidylcholine (o-14:0/16:0) was increased after 14-day exposure. Finally, the osmolytes betaine and glycerophosphocholine (GPC) were decreased.

3.4. CsA pharmacokinetics in vitro

CsA was applied daily, thus resetting the concentration to 5 or 15 μ M externally every 24 h. The measured CsA concentrations in the supernatant and cell lysates were superimposed with the best maximum posterior fit of the 3-compartment pharmacokinetic model (Fig. 5a). These predictions were generated from random, but plausible, parameter values. Overall the data is well simulated. The various curves reflect uncertainty in the model predictions, resulting from unavoidable measurement errors and modeling approximations. The posterior parameter distributions obtained after Markov-chain Monte Carlo sampling are summarized in Supplementary Table 1. CsA applied at 5 µM, demonstrated minor biokinetic alterations between day 0 and day 13 (Fig. 5b and c). Some adsorption to the plastic occurred rapidly, accounting for 6.9% of the corresponding quantity in the supernatant within 30 min and reaching its peak of 12% at 24 h on day 0. The unchanged values measured at day 13 indicate the saturation of the process. A steady-state regime was quickly reached with approximately 67% of CsA in the supernatant, 21% in the cells and 12% on the vial walls. The recovery of CsA was approximately 85% at each time point, indicating that CsA metabolism is limited.

CsA applied at 15 µM, showed major kinetic alterations over the time course (Fig. 5b and c), reflected in the increased uptake half time of 0.38 h on day 0 to 2.9 h on day 13. In addition there was an extremely high intracellular concentration at day 13, while the kinetics in the supernatant remained similar at both days. Approximate steady-state was reached in cells only after about 7 days and the distribution between supernatant, cells and vial walls was 48, 43, and 9%, respectively. The intracellular concentration measured at day 13 was 9.3 fold higher than that for 5 μ M CsA. These values represent an abrupt non-linear accumulation of CsA in cells, with increasing concentrations and could not have been detected by a single administration. CsA recovery was approximately 85% at each time point. Plastic binding of 15 μ M CsA took longer to saturate than 5 μ M, also peaking at 12% (data not shown).

The global metabolomic alterations from Fig. 4b were superimposed on the cellular kinetic data and follow the time course of intra-cellular CsA concentrations closely (Fig. 5c, boxes).

3.5. Cyclophilin B secretion

While PTX analysis revealed that cellular CyP-B was reduced with both concentrations at all time points (Fig. 3b and c), there was no alteration in the mRNA level under any condition (Fig. 3b). Thus, it is likely that CsA is binding CyP-B resulting in secretion, as previously demonstrated [24]. Therefore, we investigated CyP-B content in cell lysates and supernatants. CsA induced a time-dependent increase in



С



NMR

NMR

MS NMR

MS MS

NMR

MS

NMR NMR

MS MS MS

MS MS NMR MS MS MS

MS

MS



Glutathione and	Glutamate	Metabolism
IMDB/KEGG Name		Method

5/KEGG	Name	weth
301049	Gamma-glutamylcysteine	MS
300656	Cysteine glutathione disulfide	MS
	Total glutathione entities	NMR
303337	GSSĞ	MS
300125	GSH	MS
300641	Glutamine	NMR
300148	Glutamate	NMR
300134	Fumarate	MS

Amino Acids

		HMDB00517	L-Arginine
		HMDB00172	L-Isoleucir
		HMDB00161	L-Alanine
		HMDB00687	L-Leucine
		HMDB00883	L-Valine
		HMDB00929	L-Tryptoph
		HMDB00161	L-Alanine
		HMDB00167	L-Threonir
		HMDB00191	L-Asparate
		HMDB00191	L-Asparate

300172 L-Isoleucine 300161 L-Alanine 300687 L-Leucine 300883 I -Valine 300929 L-Tryptophan 300161 L-Alanine 300167 L-Threonine 300191 L-Asparate 300191 L-Asparate

L-gamma-glutamyl-L-leucine Sphingomyelin

Renal Osmolytes

HMDB00043 HMDB00086	Betaine sn-Glycero-3-phosphocholine	
Phosphatidylcholine		
HMDB13341 - -	PC(o-14:0/16:0) PC_784.58 PC_756.55	
Miscelland	eous	
HMDB01487 HMDB01176	NADH CMP- NeuNAc	
HMDB00094 HMDB04362 C13050	Citrate 4-Hydroxynonenal Cyclic ADP-ribose	

HMDB11171

HMDB13463

Fig. 4 - Effects of CsA exposure on RPTEC/TERT1 metabolome. (a) PCA of all measured metabolites. Numbers refer to exposure time. (b) Heat map of 192 features with significant (2 fold and p-value 0.001 cutoffs) alterations compared with time matched control. Each square represents a biological replicate (2 or 3) and colors are representative of log 2 fold time matched control values, where red is increased and green decreased. Metabolites are clustered using complete linkage. (c) Metabolites measured in cell extracts by ¹H NMR or MS as indicated. Values represent the mean log 2 fold control value from 3 biological replicates. Colors indicate increased (red) or decreased (green) metabolites. Abbreviations: CMP-NeuNAc Cytidine monophosphate N-acetylneuraminic acid.



Fig. 5 – Pharmacokinetic modeling of CsA concentrations. (a) Diagram of the 3-compartment model of CsA pharmacokinetics. CsA concentration in supernatants (b) and cell lysate (c). The data values are given by either red circles (5 μ M) or triangles (15 μ M). Metabolomic data (absolute fold-change) are summarized by box plots (bottom middle and top lines are the first median and third quartile, respectively). Thick black lines are best-fit (maximum posterior probability) model predictions. Thin black lines are predictions using 30 different parameter sets.

CyP-B secretion with a concomitant decrease in cytosolic CyP-B (Fig. 6a). The time course and magnitude of these observations were almost identical for both concentrations. At 24 h exposure, secretion was maximal and very little CyP-B was observed in supernatants on subsequent exposure days (not shown). A dose–response relationship demonstrated a maximum secretion with 5.8 μM CsA at 24 h (Fig. 6b and c).



Fig. 6 – Effects of CsA on selected proteins by Western blot analysis. (a) CyP-B levels were detected in apical supernatant and cell lysates. The CyP-B band corresponds to 25.5 kDa. (b) RPTEC/TERT1 cultured and stabilized in 96 well plates were treated with CsA for 24 h. CyP-B was detected in the supernatant and (c) quantified by densitometry. (d) RPTEC/TERT1 cells cultured on 12 well plates were treated with CsA and the Nrf2 inducer, AI1 for 1, 3 and 14 days. Nuclear and cytosolic lysates were prepared.

3.6. Effects of CsA and Nrf2 induction on selected proteins by Western blot analysis

Since the Nrf2 oxidative stress response and the 26S proteasome pathways were both significantly altered, the two transcription factors Nrf2 and Nrf1, as well as some of their regulated proteins were investigated in more detail. In addition, as a representative protein of the UPR, PERK was also investigated further. Levels of Nrf2 increased in the nuclear fraction in response to 15 μ M CsA and to the Nrf2 inducer AI1 (Fig. 6d). The response peaked at day 3 and returned to basal levels by day 14 for CsA but remained elevated for AI1. HO1 was increased in response to 15 μ M CsA in

all time points, but only at day 14 for AI1 (Fig. 6d). Conversely, NQO1 was increased by AI1 at all time points but only at day 14 with CsA (Fig. 6d). TXNRD1 levels were increased in response to 15 μ M CsA and AI1 at all time points. While we found no evidence for a CsA-induced increase in Nrf1 protein levels or nuclear translocation, two proteasome proteins of the 26S proteasome, PSMB7 (beta subunit of the 20S catalytic core) and PSMC4 (ATPase of the 19S regulatory unit) were increased by 15 μ M CsA at all time points. In addition, 5 μ M CsA increased PSMC4 levels slightly at day 14. AI1 on the other hand had no effect on PSMB7 or PSMC4 expression. PERK was induced with 15 μ M CsA at all time points, with highest levels observed at day 3 (Fig. 6d). AI1 did not induce PERK levels indicating an Nfr2 independent effect.

4. Discussion

Integrating omic approaches is becoming more important in cellular and molecular biology and will most likely change the way we approach biological investigations [4]. However, attempts thus far to combine omic data streams have been met with limited success [2,25]. In the present study, we have brought together experts from the various fields of TCX, PTX, MTX, epithelial cell culture and pharmacokinetic modeling. The major aim was to investigate the benefit of integrating omic data streams and pharmacokinetics for application in drug safety, utilizing an *in vitro* system treated with CsA in repeat dose.

The discovery of the potent immunosuppressive properties of CsA revolutionized transplant medicine. Three decades later, CsA is still one of the leading immunosuppressive agents in clinical use. However, it was recognized early on that CsA is nephrotoxic, causing disturbances to the vasculature, the glomerulus and the proximal tubule [26-28]. In addition, CsA can also induce hepatotoxicity and cardiotoxicity [29]. Although it is a very well studied compound, its exact mechanism of toxicity is still not settled. Evidence from both in vitro and in vivo studies has implicated CsA-induced reactive oxygen species (ROS) as a potential toxicity mechanism and co-administration of antioxidants appears to ameliorate nephrotoxic outcome [29,30]. It is plausible that ROS is mitochondria-derived, especially since CsA has been shown to cause injury to isolated mitochondria and to mitochondria both in vitro and in vivo [27,31-34]. Indeed, CsA has been shown to interfere with the putative mitochondrial transition pore [35], to increase both inner mitochondrial membrane potential [36] and mitochondrial calcium loading [37]. Some of these events are thought to be mediated via CsA binding and modification of the mitochondrial protein CyP-D [38]. Thus, primary mitochondrial injury is an attractive theory for the harmful effects of CsA and may explain why cells with high mitochondrial volume fraction, such as proximal tubular cells, hepatocytes and cardiac myocytes are targets. Here, 15 µM CsA increased CyP-D mRNA and the protein was induced at both CsA concentrations. In addition, 15 µM CsA exposure resulted in an early induction of lactate production, a reduction in cellular fumarate, and an increase in cellular citrate and NADH. All of these metabolic alterations point to an inhibition of mitochondrial oxidative phosphorylation.

Mitochondrial injury can lead to oxidative stress and indeed the Nrf2-oxidative-stress pathway was enriched in all omic data sets with 15 μ M CsA. We observed a robust increase in Nrf2 nuclear translocation and downstream targets, including TXN, TXNRD1, HO1, NQO1 and SRXN1. A major effect of the Nrf2 defense mechanism is to increase glutathione reserves and enhance GSSG recycling to GSH, thereby redressing the highly oxidative environment. There was an obvious impact of CsA (15 μ M) on the glutathione pathway, with an enhanced level of genes and proteins involved in glutathione synthesis and recycling (including GCLM, GCLC and GSR) increasing the cellular metabolites γ -GC and GSH.

It has also been suggested that CsA-induced proximal tubular toxicity is a result of ER stress and that ROS generation is a secondary event [39]. This is supported by a recent study which shows that antioxidant treatment does not prevent CsA-induced ER stress in HEK cells [11]. The unfolded protein response (UPR) is mounted when ER stress is detected and serves primarily to return normal ER function [40]. All three branches of the UPR were induced by 15 μ M CsA and there was a strong signature of ATF4 activation in all omic data streams. Activation of PERK results in phosphorylation of the alpha domain of eukaryotic initiation factor 2 (eIF2), inhibiting its ability to initiate translation, thereby decreasing the load of nascent proteins entering the ER [41]. However, due to the presence of two upstream open reading frames (uORFs) in the 5' leader of ATF4 mRNA, PERK activation actually increases the translation of ATF4 [42]. ATF4 is one of the main effectors of the UPR and promotes the transcription of genes involved in amino acid synthesis, amino acid transport and aminoacyl-tRNA synthesis [43]. Protein phosphatase 1 induction is a key negative feedback mechanism and acts to reactivate translation, by dephosphorylating eIF2 α [44]. The regulatory subunit of protein phosphatase 1 (PPP1R15A) was increased in the TCX data and the catalytic subunit PPP1CA was increased in the PTX data. In addition, many of the aminoacyl-tRNA synthesis genes and proteins were induced. Asparagine synthetase (ASNS) was heavily induced in both TCX and PTX data sets. ASNS catalyzes the glutamine- and ATP-dependent conversion of aspartic acid to asparagine [43], producing in the process glutamate, a precursor for glutathione synthesis. Both glutamate and glutathione metabolic pathways were severely affected. A number of amino acid transporters and intracellular amino acids were induced here. Interestingly, Nrf2 increases ATF4 transcription [21] and thus acts as a primer for UPR. ATF4 mRNA was heavily induced at all time points.

There was a strong induction of the PSM, proteasomal family members at both the mRNA and protein levels at all three time points by 15 μ M CsA. Such a rigorous induction of protein ubiquitination and proteasomal degradation is likely to necessitate removal of oxidized proteins and would be expected to run in parallel to Nrf2 activation. There has even been a suggestion that Nrf2 may directly regulate proteasomal activity [45]. However, under our experimental conditions this was not the case, as the Nrf2 activator AI1 efficiently activated Nrf2 without increasing the two proteasomal proteins PSMB7 and PSMC4. Recent evidence has shown that the proteasome is likely under the transcriptional control of the related transcription factor, Nrf1 [46]. Nrf1 was up-regulated here at the transcript level



at all time points. However, there were no alterations in Nrf1 cytosolic or nuclear protein levels. Thus it remains unclear if Nrf1 is directly involved in the proteasomal response observed here.

Cyclophilins are the primary molecular target of CsA [47] and the complex of CsA and cyclophilin leads to calcineurin inhibition and is responsible for the immunosuppressive effects [48]. Cyclophilins have a peptidyl-prolyl cis-trans isomerase (PPIase) activity and function as molecular chaperones. While all cyclophilin family members bind CsA, only CsA/CyP-A and CsA/CyP-B have been shown to inhibit calcineurin activity [49,50]. In the current study, CyP-B was the most decreased cellular protein identified by PTX at both CsA concentrations at all time points, while being unaffected at the mRNA level. Thus, we speculated that CsA exposure may induce CyP-B secretion as has been previously demonstrated in other cell culture models [24,51]. Western blot analysis confirmed that CsA induced CyP-B secretion. Interestingly, CyP-B was found only in the apical compartment, suggesting polarized secretion. It has been suggested that calcineurin inhibition is directly involved in the side effects of CsA [52,53]. However, our results provide compelling evidence for a calcineurin independent toxicity mechanism, as both 5 and 15 μ M resulted in complete loss of cytosolic CyP-B, but no cell stress was observed at 5 µM over 14 days exposure.

The applicability of sensitive high-content omic technologies and the extraction of meaningful data are highly dependent on the use of well defined, standardized, stable and relevant biological systems. The *in vitro* model we have employed is first stabilized for 10 days at confluence, allowing complete contact inhibition. We have shown that under these conditions there is no longer a time-dependent alteration in the transcriptome of untreated cells. This is likely a key factor to the success of the omic comparisons carried out in this cell model.

An obvious, yet often overlooked, aspect of in vitro approaches to drug safety assessment is the bioavailability of the compound and the concentration of the parent compound within cells as a function of time. Without this information it is not possible to compare with corresponding in vivo data. Here we used LC-MS/MS to quantify the distribution of CsA over time and constructed a pharmacokinetic model. The model describes a rapid cellular uptake and accumulation of CsA, which is to be expected for a highly lipophilic compound. Application of 5 µM CsA resulted in an intracellular steady-state after 2 days of ~860 μ M, while 15 μ M reached a steady-state after 7 days, at an intracellular concentration of \sim 7600 μ M. Thus, there is a non-linear dose-response relationship of external to internal CsA concentration due to bioaccumulation of CsA. This may be related to saturation of the p-glycoprotein extrusion pump at concentrations above 5 µM. The peak concentration of CsA in human blood, at therapeutic concentrations, has been reported to be between 100 and 830 nM [54,55]. However, it is well established that due to the lipophilicity of CsA, such measurements are highly dependent on factors including BMI, the level of lipoproteins and hematocrit level. A post-mortem study calculated that CsA is 53 times higher, on a per weight basis, in various tissues than accompanying blood samples [56]. Since we have employed a serum and blood free system, the higher

accumulation of 215 fold for 5 μ M CsA is to be expected (calculated from the average of day 13 measurements). Tissue-specific toxicities are often due to accumulation in the target tissue such as the kidney and thus this information is critical for safety evaluation. Assessment based on nominal concentrations *in vitro* or plasma levels *in vivo* alone, is imprecise, as tissue concentrations could be, as shown here for the high concentration of CsA, far above a safe threshold.

In summary, the results clearly show that cells are simultaneously experiencing mitochondrial perturbations, oxidative- and ER-stress only at the high CsA concentration. However, CyP-B secretion was maximum already at the low CsA concentration. This study demonstrates that in vitro cell culture systems coupled with pharmacokinetics and high content omic approaches can give extremely detailed and quantitative insights into both the pharmacological and toxicological effects of compounds. We also demonstrate the added value of integrating these techniques as illustrated in Fig. 7. In addition, the PTX data did not merely mirror the TCX data, but provided further information on key events, such as CyP-B secretion that is independent from gene transcription. MTX data provided an additional level of information and was particularly useful for assessing mitochondrial perturbations, a common target of xenobiotics. In conclusion, an integrated omic approach combined with stable human-derived in vitro cell culture models has the potential to considerably advance our understanding of chemical induced cellular perturbations and will be an extremely useful approach to drug safety paradigms.

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