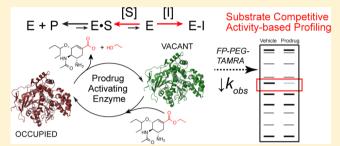


Substrate-Competitive Activity-Based Profiling of Ester Prodrug **Activating Enzymes**

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Supporting Information

ABSTRACT: Understanding the mechanistic basis of prodrug delivery and activation is critical for establishing speciesspecific prodrug sensitivities necessary for evaluating preclinical animal models and potential drug-drug interactions. Despite significant adoption of prodrug methodologies for enhanced pharmacokinetics, functional annotation of prodrug activating enzymes is laborious and often unaddressed. Activity-based protein profiling (ABPP) describes an emerging chemoproteomic approach to assay active site occupancy within a mechanistically similar enzyme class in native proteomes. The serine hydrolase enzyme family is broadly



reactive with reporter-linked fluorophosphonates, which have shown to provide a mechanism-based covalent labeling strategy to assay the activation state and active site occupancy of cellular serine amidases, esterases, and thioesterases. Here we describe a modified ABPP approach using direct substrate competition to identify activating enzymes for an ethyl ester prodrug, the influenza neuraminidase inhibitor oseltamivir. Substrate-competitive ABPP analysis identified carboxylesterase 1 (CES1) as an oseltamivir-activating enzyme in intestinal cell homogenates. Saturating concentrations of oseltamivir lead to a four-fold reduction in the observed rate constant for CES1 inactivation by fluorophosphonates. WWL50, a reported carbamate inhibitor of mouse CES1, blocked oseltamivir hydrolysis activity in human cell homogenates, confirming CES1 is the primary prodrug activating enzyme for oseltamivir in human liver and intestinal cell lines. The related carbamate inhibitor WWL79 inhibited mouse but not human CES1, providing a series of probes for analyzing prodrug activation mechanisms in different preclinical models. Overall, we present a substrate-competitive activity-based profiling approach for broadly surveying candidate prodrug hydrolyzing enzymes and outline the kinetic parameters for activating enzyme discovery, ester prodrug design, and preclinical development of ester prodrugs.

KEYWORDS: prodrug, ethyl ester hydrolysis, activation, activity-based protein profiling, SILAC, carboxylesterase

INTRODUCTION

Prodrug development typically begins with preclinical studies in mice, which are later extrapolated to predict efficacy in humans. Unfortunately, this process is complicated by interspecies differences in expression and significant genetic polymorphisms present across activating enzyme orthologues. Early knowledge of specific activation pathways would accelerate this process, enabling direct assessment of species-specific prodrug activation pathways. While this is an important goal, traditional activityguided biochemical fractionation and lengthy identification procedures hinder the annotation of prodrug activating enzymes. New methods for simplified identification of prodrug hydrolyzing enzymes would aid in the development, targeting, and optimization of new prodrug strategies.

The human genome encodes approximately 200 members of the serine hydrolase enzyme family, which carry out catalytic roles as amidases, esterases, and thioesterases of diverse cellular substrates.^{2,3} Since many prodrug moieties involve esterification or amidation, it is not surprising that serine hydrolases are often

implicated in the catabolism and activation of distinct prodrugs. Since many of these enzymes remain unannotated, biochemical fractionation is the most common approach to identify candidate prodrug hydrolyzing enzymes. We previously used such methods to identify valacylovirase (BPHL),⁴ the activating enzyme for the orally absorbed antiviral prodrug valacyclovir. Astonishingly, BPHL was first identified 8 years after valacyclovir Food and Drug Administration (FDA) approval, demonstrating the significant obstacles for mechanistic analysis of prodrug uptake pathways. Similarly, the prodrug activating enzymes for dabigatran etexilate were reported nearly 12 years after its initial preclinical discovery. 5,6 With the annotation of the physiological prodrug activating enzymes, new opportunities arise to profile expression, activity, evolutionary

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conservation, and distinct polymorphisms that help design modes of delivery, optimize biodistribution, and effectively model pharmacokinetics. These examples highlight the present challenges in developing a mechanistic understanding of prodrug activation in drug delivery.

Activity-based protein profiling (ABPP) describes the use of reporter-linked covalent inhibitors to profile abundance, activation state, and the active site occupancy across a mechanism-specific enzyme class. ABPP probes only react with functional and accessible reactive centers, and labeling is occluded by active site inhibitor occupancy. Since labeling is covalent, a reporter group (fluorophore, biotin, etc.) is irreversibly attached to its target enzymes, providing a chemical handle to visualize active enzymes using gel-based fluorescence, assessing active site competitive occlusion by mass spectrometry-based proteomics. Importantly, activity-based profiling does not require purified enzymes or tailored substrate assays, enabling direct active-site interrogation in native lysates. Activity-based probes have been extensively developed for many enzyme families⁷ including serine hydrolases,^{2,8} cysteine hydrolases, and protein kinases. In addition to profiling active hydrolases in complex proteomes, ABPP methods are especially useful for selectivity-guided medicinal chemistry, where stepwise competitive profiling highlights off-targets for optimization based on both potency and selectivity in native proteomes. 11,12

While competitive ABPP methods provide a robust approach for the discovery of active-site inhibitors, several considerations must be recognized to successfully profile targets of competitive, reversible inhibitors. Unlike competitive inhibitors, covalent inhibitors compete with activity-based probes in a nonequilibrium, time-dependent manner, which complicates profiling active site occupancy of moderate affinity ligands. To overcome this challenge, one solution is to weaken the potency of the ABPP probe using chemical modifications that preclude rapid enzyme inactivation. This kinetically tuned competitive ABPP strategy was used to evaluate *in vivo* selectivity and tissue distribution of several reversible lysophospholipase inhibitors.¹³

On the basis of these findings, we sought to extend this methodology to proteome-wide substrate-competitive profiling. When the off-rate associated with initial substrate binding is much greater than the rate of enzyme catalysis, the K_m is roughly a measure of a substrate's binding affinity for the enzyme's active site. When more than one enzyme shares a common substrate, the enzyme with the highest substrate affinity is likely the first to reach active-site saturation. Once saturated, substrate turnover is restricted by the ratedetermining enzymatic step characterized by the unimolecular rate constant k_{cat} . Therefore, we reasoned that time-dependent, substrate-directed activity-based probe competition would allow identification of candidate prodrug activating enzymes with both reasonably low $K_{\rm m}$ and $k_{\rm cat}$ values for a given prodrug. We recently demonstrated that high concentrations of the ester prodrug enalapril sufficiently compete for active site occupancy and impede fluorophosphonate inactivation of recombinant carboxylesterase 1 (CES1).14 Given these steady-state kinetic parameters, the success of this method relies on rapid incubation times (seconds to a few minutes) and optimized probe concentrations since an irreversible active site probe will react to completion and eventually eliminate any observable differences. 13,14

Using this approach, we demonstrate that saturating concentrations of the ethyl ester prodrug oseltamivir reduced

fluorophosphonate labeling of specific targets in cellular homogenates. Human liver CES1 is a known activating enzyme of several ester prodrugs, including oseltamivir. ^{5,15–18} The coexpression of multiple carboxylesterase (CES) genes 19,20 and the differential substrate preferences between species complicate direct analysis of contributions from distinct CES enzymes. To address this issue, we profiled a subset of reported mechanism-based covalent mouse CES1 inhibitors, 4-fluoro-3methylphenyl cyclohexylcarbamate (WWL50) and phenyl (3morpholinopropyl)carbamate (WWL79).²¹ Quantitative mass spectrometry and kinetic assays confirmed WWL50 potently inactivates CES1, CES2, and the highly related, human-specific carboxylesterase, CES1P1. Interestingly, WWL79 only inhibits mouse CES1 and has little effect on human CES1, which we extrapolate from homology modeling to result from a more restrictive and hydrophobic active site. Therefore, the CES1 inhibitors WWL50 and WWL79 are useful tools for defining species-specific CES1 ester prodrug activation pathways. Overall, we demonstrate that substrate-competitive ABPP can be used to quickly identify substrate-enzyme pairs in the context of a complex proteome, opening new opportunities to couple prodrug development with mechanistic analysis of enzymatic activation pathways.

■ EXPERIMENTAL SECTION

Materials. Oseltamivir phosphate (Allichem), enalapril maleate salt (Sigma-Aldrich), tazarotene (Selleckchem), benazepril HCl (Selleckchem), human carboxylesterase 1b (Corning), and carboxylesterase 2 (corning) were purchased from commercial sources. FP-PEG-TAMRA, FP-PEG-biotin, and FP-TAMRA were prepared as previously described. WWL50 and WWL79 were synthesized according to reported methods (Supporting Information).

Cell Culture, Lysis, and Fractionization. The human colon carcinoma cell line Caco-2 (ATCC, HTB-37) and human liver hepatocellular carcinoma cell line HepG2 (ATCC, HB-8065) were cultured separately in complete medium (DMEM with 1% nonessential amino acid and 10% FBS) in 100 mm tissue culture dishes in an atmosphere of 5% $\rm CO_2$ at 37 °C. Cells were grown 13–14 days postconfluence and collected in ice-cold 50 mM Tris buffer (pH 7.4) for immediate dounce homogenization, followed by high speed (100 000g for 45 min) to separate soluble (S100) and insoluble (P100) fractions. Protein sample concentrations were normalized using the BCA assay and stored at -80 °C before use.

Prodrug Hydrolysis Assays. Caco-2 S100 and P100 fractions (1 mg/mL) in 50 mM Tris buffer (pH 7.4) were treated with DMSO (0.5%) as control, FP-PEG-TAMRA (4 μM or as noted in figures), WWL50 (10 μM), or WWL79 (10 μ M) for 30 min at room temperature. Prodrugs were added for the indicated times, and the reactions were terminated with two volume equivalents of acetonitrile (ACN) with 0.1% TFA. Precipitated proteins were removed by centrifugation (13 200g for 3 min) at room temperature, and the supernatant was collected and added to Microplate PVDF filter. The filtrates were injected using an Agilent 1100 HPLC system onto a 4.6 × 150 mm² 3.5 μ m ZORBAX Eclipse XDB-C18 column (Agilent) and separated with an 11 min gradient from 2-90% buffer B (buffer A, H₂O with 0.1% TFA; buffer B, ACN with 0.1% TFA). Products were monitored by UV absorption (220 nm for oseltamivir and enalapril, 254 nm for other prodrugs). Hydrolysis rates were calculated by integrating the relative areas under the curve.

CES1 Transient Kinetic Analysis. Recombinant human carboxylesterase 1 (100 nM, 6.25 mg/L) was incubated with oseltamivir (10 mM) or vehicle (DMSO) for 8 min at room temperature in TBS-F127 buffer (50 mM Tris, 150 mM NaCl, 0.5 g/L Pluronic F127, pH 7.4), followed by the addition of FP-PEG-TAMRA (1 μ M). At the indicated time points, 20 μ L of reaction mixture was taken and inactivated with 4 µL of 6× Laemmli sample buffer and heated at 85 °C for 5 min. Mixtures were separated by SDS-PAGE using a 4-20% precast Trisglycine gel (Invitrogen) and imaged using a Typhoon 9200 fluorescence scanner. The fluorescence intensity of each band was quantified using ImageJ, and data fitting was performed in GraphPad Prism 6. Nonlinear regression analysis was used to fit the data to a first-order exponential curve of the form F(t) = $F_{\text{final}} \times (1 - \exp(-k_{\text{obs}} \times t))$, where F(t) is the fluorescence intensity at a given time, $k_{\rm obs}$ is the observed pseudo-first-order rate constant, and *t* is the reaction time.

CES1 Steady-State Kinetic Analysis. Purified recombinant human carboxylesterase 1 (160 nM, 10 mg/L) was incubated with varying concentrations of oseltamivir (0.2-5 mM) in Tris buffer (50 mM, 100 μ g/mL BSA, pH 7.4). A sample of the reaction mixture (30 μ L) was removed at 0, 5, 10, 15, and 20 min postinitiation and quenched in 60 μ L of ACN with 0.1% TFA. Mixtures were separated on an HPLC (Agilent 1100) equipped with a 4.6 \times 150 mm² 3.5 μ m ZORBAX Eclipse XDB-C18 column using an ACN gradient (11 min gradient from 2-90%). Relative levels of substrate and product were calculated by integrating the corresponding chromatographic peaks. The rate of product formation at each substrate concentration was obtained by measuring the slope associated with the time-course, and data fitting was performed in GraphPad Prism 6. Nonlinear regression analysis was used to fit the data to the steady-state Michaelis-Menten equation.

Substrate-Competitive Activity-Based Protein Profiling. Oseltamivir competition assays were performed by first incubating proteome aliquots (1 mg/mL final) with oseltamivir (10 mM) for 10 min at room temperature in 50 mM Tris buffer (pH 7.4). FP-PEG-TAMRA was then added at room temperature for less than 5 min and quenched with sample loading buffer at 85 °C for 5 min, followed by SDS-PAGE analysis (4–20%, Tris-glycine precast gel (Invitrogen)) and visualized on-gel in a Typhoon 9200 fluorescence imager. For competitive activity-based selectivity assays, proteome samples (1 mg/mL in 50 mM Tris buffer, pH 7.4) were incubated with WWL79 or WWL50 at varying concentrations for 30 min at room temperature, followed by addition of FP-PEG-TAMRA (4 μ M) for 30 min, separated by SDS-PAGE, and analyzed by in-gel fluorescence analysis.

ABPP-SILAC Analysis. Caco-2 cells were passaged more than six times in SILAC-DMEM (Thermo) supplemented with either 100 μ g/mL of $^{12}\text{C}_6$ $^{14}\text{N}_2$ -lysine and $^{12}\text{C}_6$ $^{14}\text{N}_4$ -arginine (LIGHT condition) or $^{13}\text{C}_6$ $^{15}\text{N}_2$ -lysine and $^{13}\text{C}_6$ $^{15}\text{N}_4$ -arginine (HEAVY condition), 10% dialyzed FBS (JR Scientific), and 1× penicillin/streptomycin (Life Technologies). Fractionated lysates were adjusted to final protein concentration of 1.5 mg/mL. Light and heavy fractions (1.5 mL each) were incubated separately with WWL50 (15 μ M) or vehicle for 30 min, followed by addition of FP-PEG-biotin (7.5 μ M) for 1 h. Light and heavy proteomes were then mixed in a 1:1 ratio and precipitated by chloroform/methanol extraction (1.5 vol CHCl₃: 4 vol MeOH: 3 vol water), briefly vortexed, and centrifuged (10 000g) at room temperature for 10 min to separate the aqueous and organic phases. The top aqueous

phase was carefully discarded, followed by addition of an additional three volumes of methanol and centrifugation (10 000g, 10 min). The resulting protein precipitate was then mixed with four volumes of methanol (6 mL) and sonicated at 4 °C until homogeneous. The protein precipitate was centrifuged (10 000g, 10 min), decanted, air-dried for 2-3 min, and resolubilized in 500 μ L of 6 M urea/50 mM ammonium bicarbonate buffer. The sample was then reduced with DTT (10 mM, 65 °C, 15 min) and alkylated with iodoacetamide (40 mM, room temperature, 30 min, in dark). Next, 140 μ L of 10% SDS was added, and the protein mixture was incubated at 65 °C for 10 min, followed by dilution with 5.5 mL of PBS buffer. Once cooled, streptavidin-agarose resin (Thermo Scientific, 50% slurry, 200 μ L) was added and rotated at room temperature for 1.5 h. After binding to streptavidin beads, the supernatant was removed, and the resin was washed three times with 1% SDS in PBS buffer (200 μ L) and three times with PBS buffer (200 μ L). On-bead digestion was performed for 12 h at 37 °C with trypsin (Promega) in the presence of CaCl₂ (2 mM). Peptide samples were diluted to a final concentration of 30–50 ng/ μ L with 5% (v/v) formic acid.

Mass Spectrometry and Data Analysis. Tryptic digests were separated using a Waters NanoAcquity UPLC system equipped with a 5 μ m Symmetry C₁₈ (180 μ m × 20 mm) trap column and a 1.8 μ m high-strength silica (HSS-T3) analytical column (75 μ m × 150 mm) heated to 35 °C coupled to a picotip emitter (New Objective). Tryptic peptides were loaded onto the trap column over 3 min, followed by analytical separation over a 90 min gradient (3% ACN to 40% ACN over 90 min). Peptides were analyzed using a Waters Synapt G2S HDMS time-of-flight mass spectrometer with ion mobility separation and data independent fragmentation algorithms. The quadruple mass analyzer was manually set for mass 500, 600, and 700. The sampling cone was adjusted to 32 eV, and the nano flow gas was set to flow at 0.2 bar. The purge gas was set to flow at 50 L/h, and the source temperature was set at 70 $^{\circ}$ C. For all measurements, the mass spectrometer was operated in V-mode (resolution mode) with a resolving power of at least 20 000 fwhm (full width at half-maximum) in positive-mode ESI. The time-of-flight analyzer of the mass spectrometer was calibrated with a 100 fmol/µL solution of [Glu1]-fibrinopeptide B from m/z 50–1250 to within 0.5 ppm. The data were corrected in postacquisition analysis using the doubly charged monoisotopic ion of [Glu1]-fibrinopeptide B (m/z = 785.8426) collected every 30 s from a separate calibrant fluidics source coupled to a tapertip emitter (New Objective). Accurate mass data were collected in data-independent acquisition (DIA) mode in combination with in-line ion mobility separation (IMS). For IMS, the wave height was set as 40 V and IMS wave velocity as 600 m/s. The spectral acquisition time in each mode was 0.5 s. In low-energy MS mode, data were collected without applying collision energy in the trap or the transfer stage. A collision energy (CE) ramp from 15-45 eV during each 0.5 s integration was used as standard setting for the elevated energy MS scan in the transfer region for HDMS^E mode. LC-MS spectra were collected in continuum mode and searched using the ProteinLynx Global SERVER version 3.0.2 (Waters) against the reviewed human reference proteome (UniProtKB downloaded on 2014-08-01). Precursor- and fragment-ion mass tolerances were automatically determined by PLGS 3.0.2 based on the following search criteria: (i) trypsin as digestion enzyme, (ii) a maximum of one missed cleavage, (iii) lysine (+8) or arginine (+10) defined as fixed modifier reagent group, (iv)

carbamidomethyl cysteine as a fixed modification and methionine oxidation as the variable modification, (v) a minimum of two identified fragment ions per peptide and a minimum of five fragments per protein, and (vi) at least two identified peptides/protein. The false discovery rate (FDR) for peptide and protein identification was set at 1% using a reversed database. By using in-house Python scripts, all data from technical and biological replicates were merged by removing any precursors greater than \pm 10 ppm in mass difference from the calculated theoretical mass. SILAC ratios were computed based on MS1 intensities of the SILAC precursor pairs. All reported ratios in the manuscript are consolidated ratios from runs in each direction and from merging technical replicates.

Homology Modeling and Covalent Docking. The homology model of mouse CES1 was built using chain A of the crystal structure of human CES1 (PDB ID: 2H7C) as a template. Of all the available human CES1 crystal structures, 2H7C has the highest resolution (2 Å). The homology model was built using Prime^{23,24} from the Schrodinger software suite. To prepare human and mouse CES1s for covalent docking, each protein was processed with the Protein Preparation Wizard to add hydrogens and address histidine tautomers and asparagine and glutamine flips where necessary. The carbamate bond to be broken in WWL50 and 79 for covalent docking were specified using a SMARTS string. The shape and volume of the ligand free binding site were generated with the program HOLLOW²⁵ using a grid spacing of 0.25 Å, and covalently docked models along with the volume of the binding site were rendered using PyMOL.

RESULTS

Substrate-Competitive Profiling of Oseltamivir-Binding Serine Hydrolases. Ethyl ester hydrolysis of oseltamivir is necessary to liberate the active carboxylate essential for neuraminidase inhibition²⁶ (Figure 1A). CES1 has been previously biochemically characterized as an oseltamiviractivating enzyme, yet human CES1 polymorphisms do not account for all of the variability in patient prodrug activation. Under the background of this model, we sought to establish if substrate-competitive activity-based profiling could directly annotate oseltamivir-activating enzymes among serine hydrolases present in human Caco-2 cell homogenates, a cell line that expresses multiple carboxylesterases²⁸ and is widely used for modeling human intestinal absorption.²⁹ By using this system, FP-PEG-TAMRA completely blocked oseltamivir activation, confirming members of the serine hydrolase enzyme family are solely responsible for ethyl ester hydrolysis (Figure 1B).

Next, Caco-2 soluble and insoluble homogenates were incubated with excess oseltamivir along with time-dependent addition of FP-PEG-TAMRA, 11 which enables in-gel analysis of serine hydrolase activities using a flatbed fluorescence gel scanner. After 1 min of competition, inhibition was detectable for both a 30 kDa and 60 kDa enzyme (Figure 1C). Both activities partitioned with the soluble (S100) (Figure 1D) and insoluble (P100) proteome fractions (Figure 1E). Interestingly, the 60 kDa enzyme, but not the 30 kDa enzyme, lost time-dependent competitive inhibition after 1 min. In addition, higher FP-PEG-TAMRA concentrations reduced oseltamivir competition for the 60 kDa enzyme (Supplementary Figure 1) but had little effect on the 30 kDa enzyme. Taken together, these data demonstrate that high concentrations of oseltamivir can compete for active site occupancy with the ABPP probe

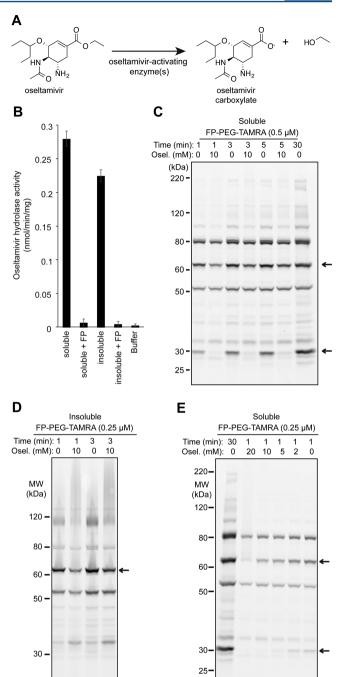
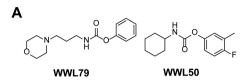
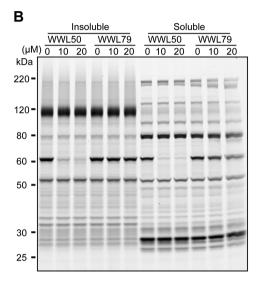


Figure 1. Substrate-competitive activity-based profiling of serine hydrolase activities in in Caco-2 homogenates. (A) Activating esterases hydrolyze oseltamivir to release oseltamivir carboxylate. (B) Oseltamivir hydrolysis is blocked in Caco-2 homogenates after fluorophosphonate (FP) treatment. (C) Time-dependent oseltamivir competition in soluble Caco-2 homogenates. (D) Time-dependent oseltamivir competition in insoluble Caco-2 homogenates. (E) Higher substrate concentrations are more efficient at fluorophosphonate competition.

FP-PEG-TAMRA in a complex proteome. Furthermore, this assay identifies targets likely inhibited by oseltamivir (30 kDa enzyme) as well as candidate activating enzymes (60 kDa enzyme). Importantly, such rapid fluorophosphonate labeling reduces the profile of detectable targets, biasing the profile toward abundant or highly FP-reactive enzymes.

Oseltamivir Is Hydrolyzed by CES1. CES1 was previously reported as an oseltamivir hydrolyzing enzyme and likely corresponds to the 60 kDa molecular weight enzyme identified by gel-based substrate-competitive ABPP. To validate the 60 kDa enzyme as CES1, we synthesized two recently reported mouse CES1 covalent inhibitors, WWL50 and WWL79, for further analysis (Figure 2A). Each inhibitor was added at room





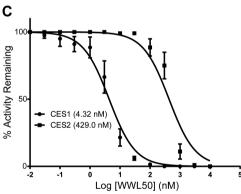


Figure 2. Human CES1 inhibition by WWL50. (A) Chemical structures of WWL50 and WWL79. (B) FP-PEG-TAMRA competitive activity-based profiling of WWL50 in human Caco-2 homogenates highlights selective inhibition. (C) WWL50 is 100× more potent for recombinant human CES1 than recombinant human CES2. Error bars represented as standard deviations of 3–4 individual experiments.

temperature to Caco-2 homogenates for 30 min, followed by FP-PEG-TAMRA labeling for an additional 30 min. Gel-based competitive ABPP analysis revealed complete inhibition of the 60 kDa enzyme by WWL50 but essentially no effect by WWL79 (Figure 2B). Neither inhibitor affected the 30 kDa band shown to be sensitive to oseltamivir. Additionally, WWL50 is nearly 100-times more potent toward human CES1 ($IC_{50} = 4.3 \pm 0.6$ nM) than human CES2 ($IC_{50} = 429.0 \pm 2.6$ nM) (Figure 2C).

While WWL50 appears highly selective by gel-based competitive ABPP, we profiled selectivity against other less abundant WWL50 targets by mass spectrometry. Using stable isotope labeling by amino acids in cell culture (SILAC), Caco-2 cells were labeled with media supplemented with either normal or isotopically heavy (Lys8, Arg10) amino acids for several passages. After separate treatment with either DMSO or WWL50, SILAC pairs of soluble and insoluble homogenates were labeled with FP-PEG-biotin and mixed in a 1:1 ratio. Following streptavidin enrichment and trypsin digestion, eluted tryptic peptides were analyzed by high-resolution mass spectrometry to quantify targets of WWL50 inhibition.³⁰ Any hydrolase inactivated by WWL50 is unreactive with fluorophosphonate-linked biotin, reducing streptavidin enrichment in one of the paired samples. This difference is measured by quantifying the ion peak area for each hydrolase peptide in both the isotopically light and heavy samples, generating a relative enrichment ratio correlated with WWL50 inhibition. Of the 41 quantified hydrolases in Caco-2 cells, WWL50 exclusively blocked the enrichment of CES1, CES2, and CES1P1 (Figure 3

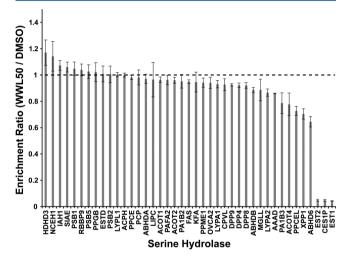


Figure 3. Identification of WWL50 targets in Caco-2 homogenates by ABPP-SILAC. Error bars represent SILAC ratio standard error quantified from tryptic peptides pooled from both soluble and membrane proteomes for two independent biological replicates. EST1 and EST2 are the human identifiers for CES1 and CES2, respectively.

and Supplementary Tables 1 and 2). Summed across reciprocal replicates (DMSO-light/WWL50-heavy and WWL50-light/DMSO-heavy), CES1 had 138 quantified SILAC peptide pairs, while CES1P1 had 15, and CES2 had just six, signifying the relative abundance of each enzyme. On the basis of these findings, CES1 is the predominant WWL50 target in Caco-2 cells contributing to oseltamivir hydrolysis.

Next, the contribution of CES1 to oseltamivir hydrolysis was measured in Caco-2 or liver HepG2 cell homogenates treated with carboxylesterase inhibitors (Figures 4 and 5A). Hydrolytic activity was roughly similar in both soluble (S100) and insoluble (P100) fractions, tracking with CES1 partitioning. Incubation with either FP-PEG-TAMRA or WWL50 completely abolished oseltamivir hydrolysis activity (>95%), while WWL79 showed fractional inhibition in Caco-2 homogenates. Collectively, these data confirm that CES1 is the primary oseltamivir hydrolase in HepG2 and Caco-2 homogenates, excluding contributions from the oseltamivir-sensitive 30 kDa enzyme observed by substrate-competitive ABPP. Similarly,

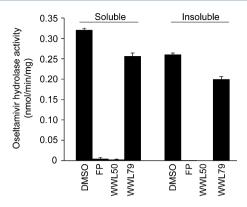


Figure 4. Inhibition of oseltamivir hydrolysis with CES1 inhibitors in Caco-2 homogenates. Results of time-dependent oseltamivir hydrolysis are shown as mean \pm SEM.

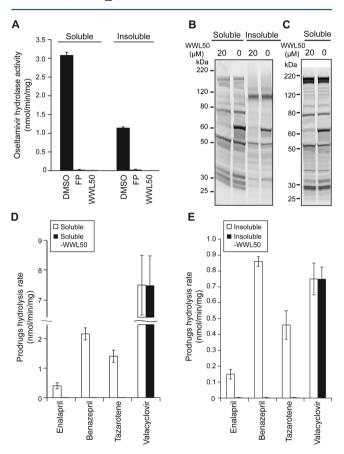


Figure 5. Ester prodrug hydrolysis in human HepG2 liver cell homogenates. (A) Fluorophosphonates and WWL50 block oseltamivir hydrolysis in HepG2 soluble and insoluble homogenates. (B) WWL50 blocks FP-PEG-TAMRA labeling of a 60 kDa serine hydrolase in soluble and insoluble homogenates from HepG2 cells, corresponding to CES1. (C) FP-TAMRA, which replaces the PEG linker with an aliphatic linker, shows similar competition for a 60 kDa serine hydrolase (CES1). (D) WWL50 blocks ethyl ester hydrolysis activity in HepG2 soluble homogenates. (E) Insoluble homogenates have reduced ethyl ester hydrolysis, but essentially all activity is blocked by WWL50. Enalapril (0.5 mM), benazapril (0.5 mM), tazarotene (0.25 mM), and valacyclovir (0.5 mM) were hydrolyzed at 37 °C in HepG2 cytosol (1 mg/mL) followed by quantitative HPLC analysis at different time points. Results are represented as the average ± SD of 2–3 individual experiments.

activation of the ester prodrugs enalapril, benazepril, and tazarotene was also eliminated by WWL50 in both soluble (S100) (Figure 5D) and insoluble (P100) fractions (Figure 5E). Importantly, valacyclovir activation was unaffected by WWL50, as the primary activating enzyme is valacyclovirase (BPHL), which is not inhibited by WWL50 or FP-PEG-TAMRA.

Kinetic Parameters for Substrate-Competitive ABPP.

As the primary activating enzyme of oseltamivir, CES1 is a promising model to define the kinetic parameters necessary for profiling prodrug-activating enzymes by substrate-competitive ABPP. Steady-state kinetic analysis of CES1-catalyzed oseltamivir hydrolysis was performed by measuring the rate of product formation in a discontinuous chromatographic assay. At a given substrate concentration, samples from the reaction mixture were taken at specific intervals and were subjected to HPLC separation and quantified by UV absorbance. CES1 showed surprisingly poor activity with oseltamivir, with $K_{\rm M}$ and $k_{\rm cat}$ values determined as 2.9×10^{-3} M and 0.75 s⁻¹, respectively. The calculated catalytic efficiency ($k_{\rm cat}/K_{\rm M}$) value is 258.6 s⁻¹ M⁻¹, which defines oseltamivir as a relatively poor substrate for CES1 (Figure 6A), yet not uncommon for

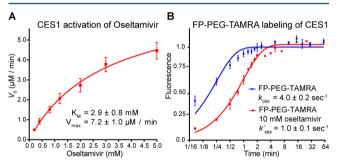


Figure 6. Oseltamivir impedes the inactivation rate of CES1 by fluorophosphonates. (A) Substrate-dependent velocity of recombinant human CES1-catalyzed oseltamivir hydrolysis and associated steady-state kinetic parameters. (B) Time-dependent fluorophosphonate inactivation of recombinant human CES1 and the associated pseudo-first-order rate constant. Near-saturating oseltamivir concentrations led to a four-fold reduction in the observed rate constant for fluorophosphonate inactivation of CES1. Error bars represent the standard deviation from 3–4 replicates.

enzymes operating in secondary metabolism. Despite these obstacles, substrate-competitive occupancy is still observed under saturating conditions. In this case, the slow $k_{\rm cat}$ likely enhances competition by extending substrate active site residency time.

To confirm substrate-competitive fluorophosphonate inactivation, time-dependent assays were performed using in-gel fluorescence of FP-PEG-TAMRA labeled CES1 (Figure 6B and Supplementary Figure S2). In the presence of excess fluorophosphonate, the time-dependent labeling of recombinant CES1 by FP-PEG-TAMRA followed pseudo-first-order reaction kinetics with an observed rate constant ($k_{\rm obs}$) of 4 s⁻¹, yielding an inactivation rate constant ($k_{\rm inact} = k_{\rm obs}/[I]$) of 4.0 × 10⁶ s⁻¹ M⁻¹. This value that is 15 000-times larger than the pseudo-second-order rate constant of CES1 for oseltamivir ($k_{\rm cat}/K_{\rm M}=258.6~{\rm s}^{-1}~{\rm M}^{-1}$). Given the rapid $k_{\rm inact}$ value, fluorophosphonate-labeled CES1 fluorescence was detectable after 5 s and nearly saturated by 1 min. We envisioned that under fully saturating substrate conditions, the rate of fluorophosphonate inactivation is limited by the rate at which

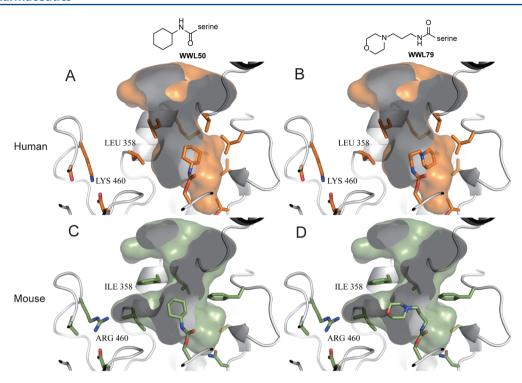


Figure 7. Covalent docking of WWL50 and 79 to human and mouse CES1. WWL50 and WWL79 were covalently docked to the catalytic serine 221 in the crystal structure of human CES1 (PDB ID: 2H7C, colored orange) and the homology model of mouse CES1 (colored green). The active site rendered as surface was clipped to show the difference in alkylaminoacyl binding site volume across human and mouse CES1s. WWL50 and 79 along with residues that differ between the human and mouse CES1 enzymes are shown as sticks. (A) WWL50 docked into the human CES1. (B) WWL79 docked into the human CES1. (C) WWL50 docked into the mouse CES1 homology model. (D) WWL79 docked into the mouse CES1 homology model.

CES1 clears its active site by turning over oseltamivir, represented by $k_{\rm cat}$. Thus, at oseltamivir saturation, the maximum theoretical reduction in the observed rate constant of FP-PEG-TAMRA labeling is 5.3-fold, or $k_{\rm obs}/k_{\rm cat}$. Indeed, in the presence of excess prodrug (ca. three-times the $K_{\rm M}$), we observed a four-fold reduction in the FP-PEG-TAMRA binding rate constant ($k'_{\rm obs}$). Accordingly, the magnitude of substrate-competitive ABPP is highly dependent on the rate of ABPP probe inactivation ($k_{\rm inact}$), the concentration of ABPP probe, the substrate $K_{\rm m}$, the substrate $k_{\rm cat}$, the substrate concentration, and the probe reaction time.

Comparison of Mouse and Human CES1 Inhibitors. WWL50 and WWL79 are potent inhibitors of mouse CES1, yet only WWL50 inhibits human CES1. Human and mouse CES1 are only 74% similar in amino acid sequence, suggesting significant evolutionary drift and potentially divergent substrate profiles. To understand the mechanism of substrate specificity, we used the reported human CES1 crystal structure (PDB ID: 2H7C)³² to build a homology model of mouse CES1 (UniProtKB ID: Q8VCC2). The covalent acylation products of WWL50 and 79 were modeled as adducts to the nucleophilic serine. Following minimization, the binding site volume of mouse CES1 appears significantly larger, suggesting access to a broader profile of substrates. While several residues contribute the volume increase, human Ile358 occupies more volume than mouse Leu358. Accordingly, the considerably larger alkyl morpholino group in WWL79 projects into the phenoxy binding site, occluding inhibitor binding (Figure 7B). In addition, mouse Arg460 is well positioned to solvate the WWL79 morpholino group through a bridging water molecule (Figure 7D), but the corresponding human Lys460 is oriented

away from this region. Reported structure—activity relationship studies using phenol groups projecting into the alkylaminoacyl binding site led to a complete loss of human CES1 binding,³³ presumably because of a lack of solvation in a hydrophobic environment. Taken together, these results suggest that the differences between human and mouse CES1s are due to hydrophobicity and binding site volume.

DISCUSSION

Identifying prodrug-activating enzymes is critical to understand the factors that contribute to drug delivery and drug efficacy, yet this analysis tends to occur late or as an afterthought in the drug development pipeline. This lag is partly a result of the typical late stage implementation of promoieties to modify biopharmaceutical properties and the time-consuming biochemical separations and assays required for validation. However, with easy access to human and animal genomic and proteomic information, this process can be greatly accelerated. In this report, we describe a substrate-competitive ABPP approach to profile cellular serine hydrolases that bind a prodrug and measure this binding through competition with broadly reactive chemical reporters targeting the serine hydrolase enzyme family. This method combines gel-based competitions with mass spectrometry protein identification, greatly accelerating the annotation of candidate prodrug binding enzymes. Further biochemical analysis is still required to confirm the enzymatic activity, and when available, selective inhibitors enable direct validation.

While this approach appears relatively straightforward, the time-dependent nature of the assay has some limitations. First, short ABPP probe reaction times are necessary to capture the

kinetic window of substrate-mediated ABPP inhibition. Indeed, FP-PEG probes react exceptionally fast with CES1, making it experimentally challenging to capture the initial kinetic window of competition and surprisingly difficult to quantify by mass spectrometry-based competitive ABPP profiling. Unfortunately, this rapid competition may also prevent the detection of substrate saturation for many enzyme reactive sites, obscuring less abundant hydrolases and reducing the limit of detection. Second, the affinity and reactivity of distinct ABPP probes toward different enzymes exhibit variable kinetic parameters. Therefore, more exhaustive profiling may require a series of kinetically tuned reactive probes with different enzyme preferences, 13 preferably with slower k_{inact} rate constants. Finally, certain enzymes may interact with substrates via a competitive or mechanism-based mode of inhibition rather than catalyzing their turnover, thus requiring additional timedependent analysis to distinguish substrate targets from true activating enzymes.

An alternative forward-genetics approach would involve overexpression or knockdown of all serine hydrolases for activity-guided assessment of the binding enzymes. Overexpressed enzymes could be tested without purification using the substrate-competitive ABPP methodology. In addition, a set of generic serine hydrolase inhibitors could be examined, which in combination with ABPP methods, could quickly reduce the number of candidate activating enzymes. While our competitive analysis identified more than one oseltamivir binding hydrolase, CES1 inhibition alone accounted for >95% of oseltamivir hydrolysis activity in intestine and liver derived cell lines. This suggests that oseltamivir is a mechanism-based inhibitor of at least one serine hydrolase (30 kDa enzyme), although it is not an efficient substrate.

All together, substrate-based ABPP provided a simplified approach to gather initial data suggestive of the candidate oseltamivir-activating enzyme. While subsequent confirmation of enzymatic activity is required, substrate-competitive ABPP provides a broad rapid survey of candidate prodrug activating enzymes. We anticipate this approach could be applied to annotate other uncharacterized prodrug activating enzymes and provide a preliminary screen to highlight candidate enzymes. Finally, using gel-based and mass spectrometry competitive ABPP approaches, we validate the species-specific inhibition profile of WWL50 in Caco-2 and HepG2 cells by establishing a useful new probe for mechanistic studies on CES1-activated ester prodrugs.

ASSOCIATED CONTENT

S Supporting Information

The Supporting Information is available free of charge on the ACS Publications website at DOI: 10.1021/acs.molpharmaceut.5b00414.

Supplementary tables (XLSX)

Supplementary methods, schemes, data, and figures (PDF)

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Author Contributions

H.X., D.D., G.L.A., and B.R.M. designed the experiments. H.X. and K.H.K. performed substrate-competitive ABPP experiments. H.X. and D.D. performed kinetic experiments. H.X. and J.D.M. performed proteomics analysis. P.G. and H.A.C. performed to the homology modeling work. H.X. and H.D.S. synthesized all the related compounds. H.X., D.D., and B.R.M. wrote the paper.

Notes

The authors declare no competing financial interest.

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ABBREVIATIONS

ABPP, activity-based protein profiling; FP, fluorophosphonate; FP-PEG-TAMRA, fluorophosphonate-polyethylene glycol-carboxytetramethylrhodamine; CESs, carboxylesterases; SHs, serine hydrolases; ABPP-SILAC, competitive ABPP with stable isotope labeling by amino acids in cell culture; HepG2, human hepatocellular carcinoma; Caco-2, human colorectal adenocarcinoma; SDS-PAGE, sodium dodecyl sulfate-polyacrylamide gel electrophoresis; DMEM, Dulbecco's modified eagle medium; FBS, fetal bovine serum; DTT, dithiothreitol; ESI, electrospray ionization; IMS, ion mobility separation; CE, collision energy; FDR, false discovery rate; SEM, standard error of mean

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