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# **High-Throughput Fluorescence Assay for Small-Molecule** Inhibitors of Autophagins/Atg4

CHIH-WEN SHU, CHARITHA MADIRAJU, DAYONG ZHAI, KATE WELSH, PAUL DIAZ, EDUARD SERGIENKO, RENATA SANO, and JOHN C. REED

Autophagy is an evolutionarily conserved process for catabolizing damaged proteins and organelles in a lysosome-dependent manner. Dysregulation of autophagy may cause various diseases, such as cancer and neurodegeneration. However, the relevance of autophagy to diseases remains controversial because of the limited availability of chemical modulators. Herein, the authors developed a fluorescence-based assay for measuring activity of the autophagy protease, autophagin-1(Atg4B). The assay employs a novel reporter substrate of Atg4B composed of a natural substrate (LC3B) fused to an assayable enzyme (PLA<sub>2</sub>) that becomes active upon cleavage by this cysteine protease. A high-throughput screening (HTS) assay was validated with excellent Z' factor (>0.7), remaining robust for more than 5 h and suitable for screening of large chemical libraries. The HTS assay was validated by performing pilot screens with 2 small collections of compounds enriched in bioactive molecules (n = 1280 for Lopac<sup>™</sup> and 2000 for Spectrum<sup>™</sup> library), yielding confirmed hit rates of 0.23% and 0.70%, respectively. As counterscreens, PLA<sub>2</sub> and caspase-3 assays were employed to eliminate nonspecific inhibitors. In conclusion, the LC3B-PLA, reporter assay provides a platform for compound library screening for identification and characterization of Atg4Bspecific inhibitors that may be useful as tools for interrogating the role of autophagy in disease models. (Journal of Biomolecular Screening XXXX;xx-xx:xx)

Key words: autophagy, Atg4, autophagin, high-throughput screening, protease

#### INTRODUCTION

UTOPHAGY IS AN EVOLUTIONARILY CONSERVED PROCESS whereby cells catabolize damaged proteins and organelles for purposes of generating substrates for sustaining adenosine triphosphate (ATP) production during times of nutrient deprivation.<sup>1,2</sup> Three types of autophagy have been described based primarily on cellular morphology considerations, including macroautophagy, microautophagy, and chaperone-mediated autophagy.<sup>3</sup> For the most part, autophagy-related genes (Atg) are required for these 3 forms of autophagy, with some minor difference.<sup>4,5</sup> The genes responsible for autophagy have been identified, largely through genetic analysis of yeast, Saccharomyces cerevisiae, and are conserved in mammals, plants, and essentially all eukaryotes.6

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Roles for autophagy have been suggested in either causation or prevention of disease. For example, autophagy has been implicated in eliminating senescent and insoluble proteins that are not degraded via proteasome-based mechanisms, representing an important "housekeeping" function for some types of cells, such as neurons, where it may be helpful for preventing protein inclusion body diseases associated with neurodegeneration.<sup>7,8</sup> Autophagy also plays helpful roles in the context of host-pathogen interactions, where autophagic vesicles help to surround intracellular virus particles and bacteria, targeting them for lysosomal destruction. 9,10 In contrast, autophagy may promote the pathogenesis and progression of tumors, allowing cancer cells to survive nutrient-poor and hypoxic environments such as those found in the centers of rapidly growing malignant lesions that have outstripped their vascular supply. 11 Conversely, some components of the autophagy machinery have also been reported to be required for nonapoptotic cell death, suggesting the concept of autophagic cell death.<sup>12</sup> Altogether, the role of autophagy in disease remains largely controversial.

Chemical inhibitors of autophagy are essentially nonexistent, with the few agents available for aiding research. The compound 3-methyladenine (3-MA) has been touted as an autophagy inhibitor but requires millimolar concentrations to inhibit class III phosphatidyl inositol kinases (PI3Ks) involved in autophagy. 13 Bafilomycin A1 is also commonly employed for suppressing autophagic flux due to its inhibition of the vacuolar type H<sup>+</sup>-ATPase (V-ATPase), blocking acidification of lysosomes and endosomes. However, long-term treatment (>4 h) of cells with bafilomycin A1 also interferes the trafficking of proteosomes, endosomes, and other cellular processes.<sup>14,15</sup> A need therefore exists for chemicals that target specific components of the autophagy machinery for use as research tools for addressing questions about autophagy mechanisms and investigating the role of autophagy in diseases.

Autophagins are a class of cytosolic cysteine proteases required for autophagy. 16 Autophagins cleave Atg8 to promote its conjugation with phosphatidylethanolamine (PE) in the membranes of autophagic vesicles by a ubiquitin-like system, which is required for autophagosome formation and participates in targeting these vesicles to lysosomes for fusion and degradation of their contents.<sup>17</sup> Autophagins also promote deconjugation of Atg8-PE to liberate Atg8 from membrane at or before the final stage of fusion between autophagosome and lysosomes, suggesting that deconjugation of Atg8-PE is required for the fusion.<sup>18</sup> The human genome contains 4 independent genes encoding the Atg4 orthologs (termed autophagins), including Atg4A/ autophagin-2, Atg4B/autophagin-1, 4C/autophagin-3, and 4D/ autophagin-4.16 Atg4B cleaves most of human Atg8 homologs in vitro, including (1) microtubule-associated light chain 3 (LC3; which has A, B, and C isoforms), (2) GABA(A) receptorassociated protein-like 1 (GABARAP-L1), (3) GABA(A) receptor-associated protein (GABARAP), and (4) Golgi-associated ATPase enhancer of 16 kDa (GATE-16, also known as GABA(A) receptor-associated protein-like 2).19-21 In contrast, Atg4A has activity mainly for GATE-16 in vitro.22 Atg4B knockout mice show reduction of proteolysis of all Atg8 homologs except GATE-16, suggesting that Atg4A compensates for cleavage of GATE-16 in Atg4B knockout mice.<sup>21</sup> By comparison, Atg4C and Atg4D show minor protease activity or require posttranslational modification (caspase-3 cleavage) for activation, 20,23 indicating Atg4B is functionally dominant in the regulation of autophagy.

In this study, we have selected autophagin-1/Atg4B as a target for developing novel inhibitors of autophagy. We devised a Atg4B high-throughput screening (HTS) assay using a LC3B-PLA $_2$  reporter substrate (Shu, 2010 #16880) in 384-well format that has excellent performance characteristics (Z' factor >0.7) and verified by pilot library screening and counterscreens that the assay is suitable for HTS of chemical libraries.

# **EXPERIMENTAL PROCEDURES**

#### Plasmid constructions

Plasmids for bacterial expression of autophagin-1 (Atg4B) and substrate protein LC3B were constructed as previously described. Briefly, PCR products were cloned into bacterial expression vector pETDuet-1 (Novagen, San Diego, CA) in frame with an N-terminal His tag. The mature human phospholipase A<sub>2</sub> (PLA<sub>2</sub>) group X G10 (amino acids 43-165) was amplified from a human fetal brain cDNA library (Open Biosystems, San

Diego, CA) and fused with LC3B in pETDuet-1. Site-directed mutagenesis of Atg4B C74A or LC3B G120A was carried out by the QuickChange kit according to the manufacturer's instructions (Stratagene, La Jolla, CA).

## Protein expression and purification in Escherichia coli

Atg4B or catalytic mutant Atg4B C74A expression plasmid was transformed into *Escherichia coli* BL21 (DE3; Invitrogen, San Diego, CA). Protein expression was induced by 0.1 mM isopropyl β-D-1-thiogalactopyranoside (IPTG; Invitrogen) at 15°C for 6 h. His<sub>6</sub>-tagged proteins were purified using Ni-NTA-agarose (Qiagen, Valencia, CA) and eluted with a 20- to 250-mM imidazole gradient in 20 mM Tris (pH 8.0), 150 mM NaCl, and 10 mM β-mercaptoethanol.

His<sub>6</sub>-tagged LC3B-PLA<sub>2</sub> protein was induced by 1 mM IPTG at 37°C for 4 h to obtain inclusion bodies. The inclusion bodies were solubilized with 20 mM Tris buffer (pH 8.0) containing 0.5 M NaCl, 5 mM imidazole, 6 M guanidine hydrochloride, and 1 mM β-mercaptoethanol and loaded into the Ni-NTA column. The denatured proteins were refolded with refolding buffer (20 mM Tris [pH 8.0], 0.5 M NaCl, 20 mM imidazole, 1 mM β-mercaptoethanol) in the presence of linear 6-0 M gradient urea. The refolded proteins were eluted with a 20- to 500-mM gradient imidazole in 20 mM Tris (pH 8.0), 150 mM NaCl, and 10 mM β-mercaptoethanol.

For production of active  $PLA_2$  protein,  $LC3B-PLA_2$  fusion protein (2.5  $\mu$ M) was incubated with Atg4B (100 nM) in  $PLA_2$  reaction buffer (20 mM Tris-HCl [pH 8.0], 2 mM  $CaCl_2$ , and 1 mM dithiothreitol [DTT]) at room temperate for 16 h. The cleaved  $PLA_2$  protein was purified with Ni-NTA column (Qiagen) to remove  $His_6$ -tagged LC3B and Atg4B. Caspase-3 protein was purified as described previously.  $^{24,25}$ 

# Atg4B cleavage of synthetic protein substrates

Atg4B (wild-type [WT]) or catalytic mutant Atg4B C74A was incubated with 400 nM protein substrates in a 50-μL reaction buffer containing 50 mM Tris (pH 8.0), 150 mM NaCl, and 1 mM DTT at 37°C for 1 h. Reactions were stopped by addition of 50 μL of 2× Laemmli sodium dodecyl sulfate (SDS) sample and subjected to 13% SDS–polyacrylamide gel electrophoresis (PAGE) followed by GelCode Blue staining (Thermo Fisher Scientific, Asheville, NC) or transfer to nitrocellulose membranes (Sigma-Aldrich, St. Louis, MO) for immunoblotting analysis using anti-myc antibody (Roche, Indianapolis, IN). Proteins were detected using peroxidase-conjugated antimouse IgG secondary antibody by Super Signal and chemiluminescence substrate (Pierce, Rockford, IL) with exposure to X-ray film.

# Atg4B activity measured using LC3B-PLA, substrate

The assay was modified from a previous report.<sup>26</sup> Briefly, recombinant Atg4B was mixed with LC3B-PLA<sub>2</sub> fusion protein

to a final volume of 20 µL PLA, reaction buffer (20 mM Tris-HCl [pH 8.0], 2 mM CaCl<sub>2</sub>, and 1 mM DTT) containing 20 μM 2-(6-(7-nitrobenz-2-oxa-1,3-diazol-4-yl)amino) hexanoyl-1-hexadecanoyl-sn-glycero-3-phosphocholine (NBD-C<sub>6</sub>-HPC) (Invitrogen) in wells of black-walled 384-well plates (Greiner Bio-One, Frickenhausen, Germany). Fluorescence intensity was measured for various times using an Analyst<sup>TM</sup> HT (Molecular Devices, Sunnyvale, CA) at room temperature with excitation and emission wavelengths of 485 and 530, respectively. Data were analyzed by GraphPad Prism software (GraphPad Software, San Diego, CA). To determine robustness of the assay, Z' factor was calculated as a defined equation:  $1-3(SD_{+Atg4B}+SD_{-Atg4B})/mean_{+Atg4B}-mean_{-Atg4B}$ , where SD is the standard derivation of signal for both positive (+Atg4B) and negative (\_Atg4B) controls.<sup>27</sup>

# High-throughput screening

For HTS, 20 nL of each compound (10 mM in DMSO) of 1280 compounds from the LOPAC™ library (Sigma-Aldrich) or 2000 compounds from the Spectrum™ library (Spectrum Chemicals & Laboratory Products, Gardena, CA) were plated into black 384-well, round-well plates using a Labcyte Echo 550 acoustic pipetter (Agilent Technologies, Wilmington, DE). Recombinant Atg4B (0.2 nM, 10 μL) was dispensed to each well using ThermoScientific Matrix WellMate bulk dispenser (Thermo Fisher Scientific). LC3B-PLA<sub>2</sub> fusion protein (50 nM, 10  $\mu$ L) diluted in 2× PLA<sub>2</sub> reaction buffer (40 mM Tris-HCl [pH 8.0], 4 mM CaCl<sub>2</sub>, and 2 mM DTT) containing 40 μM NBD-C<sub>6</sub>-HPC (Invitrogen) was then added to each well. Fluorescence intensity was measured within 30 to 60 min using an Analyst<sup>TM</sup> HT (Molecular Devices) at room temperature with excitation and emission wavelengths of 485 and 530, respectively. The inhibition of compounds was recorded as percentage compared to DMSO control. Twofold serial dilutions (maximal final concentration 100 µM) of compounds were used for determination of dose-responsive curves. IC<sub>50</sub> values were calculated by nonlinear regression analysis employing GraphPad Prism software (GraphPad Software).

# Counterscreens for PLA, and caspase-3 assay

For the PLA<sub>2</sub> assay, 20 nL of each hit (10 mM in DMSO) from LOPAC<sup>TM</sup> or Spectrum<sup>TM</sup> libraries was plated into black 384-well, round-well plates using a Labcyte Echo 550 acoustic pipetter (Agilent Technologies). Active PLA<sub>2</sub> (500 nM, 10 µL) was dispensed to each well, then mixed with NBD-C<sub>6</sub>-HPC (Invitrogen; 20 μM, 10 μL) in PLA, reaction buffer at room temperature for 2 h. Fluorescence intensity was measured with excitation and emission wavelengths of 485 and 530, respectively. Caspase-3 assay was determined using methods modified from a previous report.<sup>25</sup> Briefly, His -tagged caspase-3 (1 nM, 10 µL) was mixed with acetyl-Asp-Glu-Val-Asp-AFC (200 µM, 10 µL) in assay buffer

(50 mM HEPES [pH 7.4], 10% sucrose, 1 mM EDTA, 0.1% 3-[(3-cholamidopropyl)dimethylammonio]-1-propanesulfonate [CHAPS], 100 mM NaCl, and 1 mM DTT) in wells of white 384well plates containing 20 nL hit compound (10 mM in DMSO). Fluorogenic AFC product was measured at 37°C for 1 h with excitation and emission wavelengths of 405 and 510, respectively.

#### **RESULTS**

# Development of Atg4B assay based on LC3B-PLA, fusion protein substrate

To develop a primary HTS assay for autophagins, we generated an expression plasmid for production of LC3B-PLA, fusion protein (substrate) in bacteria. The enzyme phospholipase A<sub>2</sub> (PLA<sub>2</sub>) is inactive when expressed as a fusion protein with polypeptide appendages added to its N-terminus (Fig. 1A).<sup>28</sup> LC3B is among the endogenous substrates of autophagin-1/Atg4B. Thus, we generated a novel substrate for autophagin screening by producing a recombinant LC3B-PLA<sub>2</sub> fusion protein, such that Atg4-mediated cleavage of LC3B liberates active PLA, (Shu, 2010 #16880). Using bacterially expressed, purified His<sub>6</sub>-Atg4B (protease), we determined that cleavage of LC3B-PLA2 by Atg4B is done in a concentration-dependent manner, as shown by monitoring cleavage products by SDS-PAGE with protein stains or immunoblotting (Fig. 1B). Moreover, cleavage of the LC3B-PLA<sub>2</sub> substrate was not observed with an Atg4B catalytic mutant (Cys/Ala). Importantly, NBD fluorescence release from the PLA2 substrate NBD-C<sub>6</sub>-HPC also increased in a concentration-dependent manner, as measured in a plate reader assay (Fig. 1C).

We also explored the reactivity of Atg4B on a mutant of LC3B-PLA<sub>2</sub> in which the glycine residues at which LC3B cleavage normally occurs was converted to alanine. Atg4B only slightly cleaved the LC3B-PLA<sub>2</sub> (Gly/Ala) mutant as measured by generation of PLA2 activity (Fig. 1B). We presume that the PLA<sub>2</sub> activity generated from exposure of the mutant substrate to Atg4B may be due to cleavage at a glycine residue provided by PLA, because glycine is the first reside in PLA, where fusion to LC3B occurred (the wild-type junction sequence is ETFGGILE, where bold indicates the site of cleavage, and the mutant sequence is ETFAGILE).

To determine the optimal concentration of Atg4B and LC3B-PLA, for the assay, the concentration of Atg4B was titrated by 2-fold serial dilution from 1250 to 0 pM (Fig. 2A). Atg4Bmediated increase of fluorescence in LC3B-PLA, containing reactions was observed in a time- and concentration-dependent manner. Similar to prior reports using ubiquitin-PLA<sub>2</sub> for assays<sup>26</sup> of deubiquiteness, a kinetic lag effect was observed at low concentrations of Atg4B (<160 pM), which has been attributed to PLA<sub>2</sub> substrate NBD-C<sub>6</sub>-HPC-forming micelles. Next, LC3B-PLA<sub>2</sub> was 2-fold serial diluted from 200 to 0 nM for assessing optimal substrate concentration (Fig. 2B), showing the apparent  $K_m$  is approximately 25 nM.

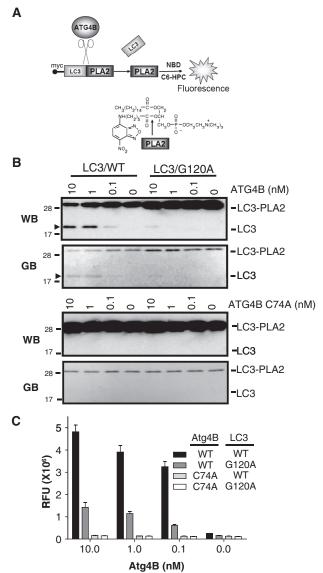
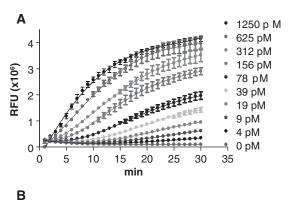


FIG. 1. Generation of Atg4B assay using LC3B-PLA, substrate. (A) Scheme depicting basis for the LC3B-PLA, substrate for monitoring Atg4B activity. Atg4B cleaves the Gly120 site of proLC3B to release catalytically active PLA2, which hydrolyzes NBD-C6-HPC, generating fluorescence. (B) Tenfold serial dilutions of 10 nM Atg4B wild-type (top panel) or catalytic mutant (bottom panel) were incubated with 400 nM LC3B-PLA, wild-type or cleavage site mutant (G120A) fusion proteins at 37°C for 1 h. Cleavage of LC3B-PLA, proteins was determined by SDS-PAGE with immunoblotting (WB) or GelCode Blue staining (GB). Arrowheads indicate cleavage product. (C) Tenfold serial dilutions of Atg4B wild-type or catalytic mutant (maximal final concentration 10 nM) were incubated with 100 nM LC3B-PLA, wildtype or cleavage site mutant (G120A) fusion proteins in PLA<sub>2</sub> reaction buffer (20 mM Tris-HCl [pH 8.0], 2 mM CaCl<sub>2</sub>, and 1 mM dithiothreitol) containing 20 μM NBD-C<sub>6</sub>-HPC at room temperature for 30 min. PLA, activity was monitored by hydrolysis of NBD-C<sub>6</sub>-HPC, measuring fluorescence with excitation and emission filters of 485 nm and 530 nm, respectively, and reporting results as relative fluorescence units (RFU). Data represent the mean  $\pm$  SD of 4 experiments.



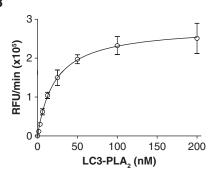


FIG. 2. Determination of optimal concentrations of Atg4B and LC3B-PLA<sub>2</sub> for the high-throughput screening assay. (A) Twofold serial dilutions of Atg4B (maximal final concentration 1250 pM) were mixed with 100 nM LC3B-PLA2 to a final volume of 20 µL in wells of black-walled 384-well plates at room temperature. PLA, activity was monitored by hydrolysis of NBD-C<sub>6</sub>-HPC, measuring fluorescence with excitation and emission filters of 485 nm and 530 nm, respectively. Data represent enzyme progress curves, showing relative fluorescence units (RFU) generated over time. (B) Twofold serial dilutions of LC3B-PLA, (maximal final concentration 200 nM) were incubated with 0.1 nM Atg4B in the PLA<sub>2</sub> reaction buffer at final volume of 20 μL in 384-well plates at room temperature for 30 min. The rate of PLA<sub>2</sub> activity generation was measured (RFU/min). Data processing was performed using nonlinear regression analysis employing GraphPad Prism software. Data represent the mean ± SD of 4 experiments.

# HTS implementation of the LC3B-PLA<sub>2</sub> reporter assay for Atg4B

To study assay performance for the HTS environment, the Atg4B assay was tested in 384-well plates using 96 wells each of (a) the negative control (without Atg4B); (b) the positive control (Atg4B without inhibitors); (c) a control for protease inhibition (Atg4B with general cysteine protease inhibitor N-ethylmaleimide (10 mM), which covalently modifies the active site cysteine of proteases; and (d) EGTA (5 mM), a chelator of calcium, which is essential for PLA<sub>2</sub> activity (Fig. 3). For this experiment, LC3B-PLA<sub>2</sub> was employed at 25 nM and protein at 0.1 nM, based on the results from the dose-response analysis. Fluorescent intensity was measured for up to 5 h (Fig. 3B). The Z' statistic was calculated from the data and

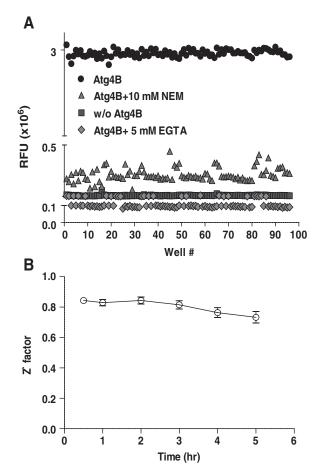


FIG. 3. Characterization of LC3B-PLA<sub>2</sub> reporter assay for highthroughput screening. (A) LC3B-PLA, (25 nM) was incubated without (squares) or with (circles) Atg4B (0.1 nM) in the absence or presence of calcium chelator, EGTA (5 mM) (diamonds), or general cysteine protease inhibitor, N-ethylmaleimide (10 mM) (triangles), in PLA, reaction buffer (20 mM Tris-HCl [pH 8.0], 2 mM CaCl,, and 1 mM dithiothreitol) containing 20 μM NBD-C<sub>6</sub>-HPC for 0.5 h using 96 replicate wells of 384-well plates for each condition. PLA, activity was measured by fluorescence intensity with excitation and emission filters of 485 nm and 530 nm, respectively, and reporting results as relative fluorescence units (RFU). (B) The Z' factor was calculated according to positive control (with Atg4B) and negative control (without Atg4B) over time, from 0.5 to 5 h.

determined to be >0.7 when measured from 0.5 to 5 h. Thus, the assay exhibits performance characteristics sufficient for use in HTS with robust performance for at least 5 h after preparing reactions in microwells.

# Screening and characterization of hits from the LOPAC<sup>TM</sup> and Spectrum<sup>TM</sup> libraries

Next, we undertook a pilot screen of a chemical library (LOPACTM) enriched in bioactive molecules to test the performance of the HTS assay (Fig. 4A). The compound library was screened at an average compound concentration of approximately 10 µM at room temperature for 1 h, which is within the linear range of the HTS assay. The assays contained 0.1% DMSO final volume. From this screen of 1280 chemical compounds, we obtained 4 hits (cut-off of 50% inhibition). The hits were cherry picked and retested at the screening concentration. Of these, 3 hits were confirmed, constituting a hit rate of 0.23% (see Supplemental Figure S1A). One of the hit compounds (A1895) has been found previously by us to inhibit GAPDH and UBC13 (data not shown), which are both enzymes that contain cysteine in their active sites, suggesting that this compound is nonselective. The remaining 2 hits from HTS were first filtered with a PLA, counterscreen assay to eliminate compounds directly inhibiting PLA, or interfering with fluorescence (see Supplemental Figure S1B). Neither of the hits directly inhibited PLA,. Next, hits were also evaluated using a counterscreen assay for caspase-3, another class of cysteine protease, to eliminate redox-active compounds that attack cysteine within the catalytic centers of enzymes (see Supplemental Figure S1C). Both of the remaining compounds inhibited caspase-3, indicating that they are nonselective. Although no promising hits were obtained from the LOPAC<sup>TM</sup> library, the conditions used for library screening provided a reasonable hit rate.

We therefore also screened the Spectrum<sup>TM</sup> library, which consists of 2000 bioactive compounds. Again, the HTS assay was performed at room temperature for 1 h. After screening and confirmation, 14 of initial 25 hits were confirmed, thus representing a confirmed hit rate of 0.7% (Fig. 4B,C). The hits were evaluated with 2 counterscreens: PLA, and caspase-3. Inhibitor controls for the counterscreen assays included EGTA (5 mM, PLA, assay) and zVAD-fmk (10 μM, caspase-3 assay) (Fig. 4D,E). The Z' factors were 0.78 and 0.60 for the PLA, and caspase-3 assay, respectively. Only 1 of the 14 confirmed hits showed inhibitory activity in the PLA, counterscreen assay, indicating that it was a false positive (Fig. 4D). None of the hits inhibited caspase-3 activity (Fig. 4E).

We also tested the hits with LCB-PLA, reporter assay in kinetic mode using covalent inhibitor iodoacetamide (IAA) as a positive control, which attacks the active site cysteine of Atg4B (see Supplemental Figure S2). Each of the hits reduced the slope of the enzyme progress curves, showing slower but linear rates of substrate hydrolysis. Finally, the hits were tested using our autophagin-1 HTS assay with or without DTT to identify redox-active compounds that generate superoxide and thus oxidize cysteines in target proteins.<sup>29,30</sup> Two of the compounds (1504078 and 1504080) showed additive inhibition in the presence of DTT and thus are likely to inhibit in vitro through a redox-based mechanism (see Supplemental Figure S3).

The hits were then cherry picked for dose-response testing (Table 1). Of the 13 remaining hits, 4 inhibited Atg4B with IC<sub>50</sub> <10 μM, showing concentration-dependent inhibition with well-fitted curves using the Hill equation ( $0.5 \le H \le 1.5$ ,

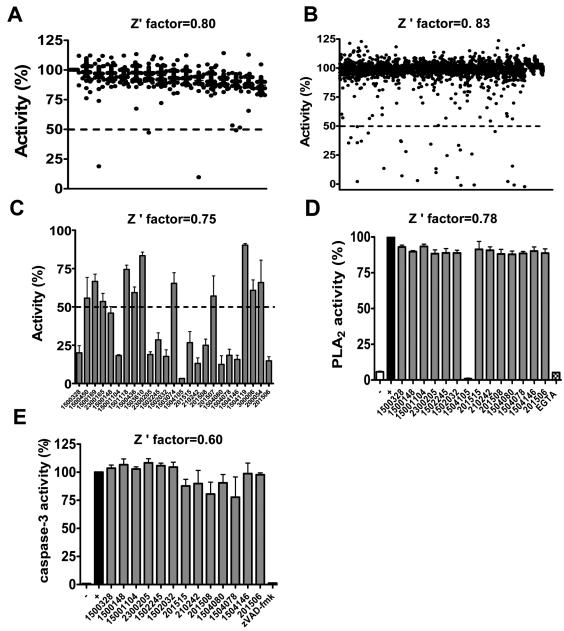


FIG. 4. High-throughput screening (HTS) for Atg4B inhibitors—pilot library screens. (A) LC3B-PLA<sub>2</sub> (25 nM) was mixed with Atg4B (0.1 nM) in PLA, reaction buffer containing 20 μM NBD-C<sub>6</sub>-HPC on ice, and then 20-μL aliquots were dispensed into wells of a 384-well plate containing compounds (10 µM average approximate concentration) of the LOPACTM collection for 1 h. PLA<sub>2</sub> activity was measured as a percentage relative to control wells that received DMSO only. Z' factor was calculated by including a row of wells without Atg4B as a negative control (assay minimum) and a row of wells with Atg4B without compounds (DMSO only) as positive control (assay maximum). The 50% inhibition cut-off used for hit calling is indicated. (B) Assays were performed as in A using the Spectrum<sup>™</sup> library. (C) LC3B-PLA, (25 nM) and Atg4B (0.1 nM) were mixed with hits from HTS using the Spectrum<sup>TM</sup> library in PLA<sub>2</sub> reaction buffer (20 mM Tris-HCl [pH 8.0], 2 mM CaCl<sub>2</sub>, and 1 mM dithiothreitol) containing 20 µM NBD-C<sub>6</sub>-HPC for 1 h. The PLA, activity was measured as percentage compared to positive control (Atg4B alone). (D) The confirmed hits were mixed with active PLA, (250 nM) assay in the reaction buffer containing 20 μM NBD-C<sub>ε</sub>-HPC at room temperature for 2 h to eliminate the compound directly inhibiting PLA<sub>2</sub> or interfering with fluorescence. The PLA<sub>2</sub> activity was measured as a percentage compared to the positive control (PLA, alone). EGTA (5 mM) was used as control for inhibiting PLA, activity. (E) The confirmed hits were mixed with caspase-3 (0.5 nM) in assay buffer containing Ac-DEVD-AFC (100 µM) at 37°C for 1 h. The activity of caspase-3 was measured by AFC fluorescence with excitation and emission filters of 400 nm and 505 nm, respectively, reporting results as a percentage compared to positive control (+, caspase-3 alone). zVAD-fmk (10 µM) was used for inhibiting caspase-3 activity.

**Table 1.** IC<sub>50</sub> Determination for Screening Hits Using the LC3B-PLA2-Based Assay

Compound ID	$IC_{50}$	Hill Slope
1500328	11.1	1.2
1500148	13.7	0.8
1501104	2.0	1.7
2300205	22.0	1.7
1502245	5.5	1.2
1502032	10.1	1.0
201515	8.5	4.8
201508	2.3	1.0
1504080	1.1	1.4
1504078	1.7	1.2
201506	11.3	1.8
210242	5.6	2.4
1504146	12.3	0.7

Reactions containing Atg4B (0.1 nM) and LC3B-PLA, (25 nM) were incubated with 2-fold serial dilutions of 14 screening hits (maximum final concentration 100 uM) obtained from the Spectrum<sup>™</sup> library. Estimated IC<sub>50</sub> values and Hill slopes for each hit were determined. Data are mean of triplicate determinations.

 $r^2 > 0.9$ ; **Fig. 5**). The IC<sub>50</sub> of compounds 201508, 1502245, 1504078, and 1504080 was estimated at 2.3, 5.5, 1.7, and 1.1 μM (mean ± SEM), respectively. Taken together, our HTS assay provides the first platform for screening chemical libraries for autophagin inhibitors.

#### DISCUSSION

Autophagins play a crucial role in conjugation and deconjugation of Atg8 paralogs to autophagic vesicles and are indispensable for the process of autophagy.<sup>31</sup> Chemical inhibitors of autophagy are largely lacking, thus representing a void in the armamentarium of experimental approaches available to study this process. In this study, we have devised an HTS fluorogenic assay for measuring activity of autophagin-1 (Atg4B). The assay performs robustly in the 384-well environment with Z' factors consistently >0.7. The signal-to-noise ratio and reproducibility of the assay are sustained for at least 5 h, which is appropriate for HTS applications. Moreover, acceptable hit rates were obtained in pilot screens of 3280 bioactive compounds at  $\sim 10 \mu M$ , with confirmed hit rates of 0.23% to 0.70%. Finally, the expression plasmids and methods for bacterial expression that we have described for recombinant Atg4B (protease) and LC3B-PLA, (substrate) proteins provide excellent yields (~6 mg/L culture), thus making large-scale chemical library screening entirely feasible.

PLA, has been used previously in other protease applications because of the inhibitory effect that N-terminal appendages have on this enzyme.26 When expressed as a fusion protein with a cleavable N-terminus, PLA, serves as a convenient reporter for monitoring protease activity. For example, ubiquitin-PLA, fusion protein is cleaved by deubiquitin enzymes (DUBs) and efficiently

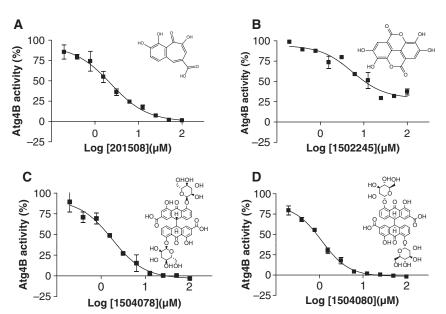


FIG. 5. Dose-dependent inhibition of Atg4B by screening hits. Reactions containing Atg4B (0.1 nM) and LC3B-PLA, (25 nM) were incubated with 2-fold serial dilutions of screening hits (maximum final concentration 100 µM), including (A) 201508, (B) 1502245, (C) 1504078, and (D) 1504080. Fluorescence was measured with excitation and emission filters of 485 nm and 530 nm, respectively, and reporting results as a percentage of control activity for reactions receiving only DMSO. The estimated IC<sub>50</sub> values are 2.3, 3.0, 1.7, and 1.1 µM for compounds 201508, 1504105, 1504078, and 1504080, respectively, compared to positive control (DMSO). Representative graphs are shown. Data are mean ± SEM of triplicate determinations. The structure of hits is shown in each panel.

produces active PLA<sub>2</sub>. The LC3B-PLA<sub>2</sub> fusion protein substrate that we have recently described and characterized represents the first application of the PLA, fusion protein approach to autophagy proteases.<sup>19</sup> Compared to AFC (7-amino-4-trifluoromethyl coumarin)-conjugated tetrapeptide substrates that we investigated in a previous study, 19 the catalytic efficiency of the LC3B-PLA<sub>2</sub> substrate is  $5.7 \times 10^5$  higher ( $k_{cat}/K_m 5.26 \times 10^5 \text{ M}^{-1}/\text{s}^{-1}$ ). In this regard, the crystal structure of the LC3/Atg4B complex has shown that full-length LC3B induces conformational changes in Atg4B that promote formation of the active catalytic site,<sup>32</sup> thus presumably explaining why our LC3B-PLA, protein substrate is far superior to peptide substrates. Thus, the LC3B-PLA, substrate is not only more physiological but is also much more efficient from the perspective of enzyme kinetics.

We have also begun to create additional PLA, fusion proteins with other autophagin substrates appended, including GATE-16 and GABARAP-L1, which can serve as alternatives to LC3B-PLA, for some autophagins or as secondary assay reagents for independent confirmation of hits. In this regard, Atg4 members have differential substrate specificities. For example, Atg4A mainly cleaves GATE-16, whereas Atg4D cleaves both GATE-16 and GABARAP-L1.20,22 Thus, GATE-16-PLA, fusion protein may provide a suitable substrate for Atg4A and Atg4D assay development. Indeed, we have generated and successfully tested a GATE-16-PLA, fusion protein for measuring activity of recombinant Atg4A,19 using essentially the same assay conditions reported here (data not shown).

After counterscreening and elimination of false positives using a PLA, counterscreen, 4 compounds were identified from among 3280 bioactive molecules, showing concentrationdependent inhibitory activity (IC $_{50}$ <10  $\mu$ M) against Atg4B but not an alternative class of cysteine protease, caspase-3. Further testing using our autophagin-1 HTS assay in the presence or absence of DTT eliminated 2 compounds (1504078 and 1504080) that showed additive inhibition in the presence of DTT, indicating that hydrogen superoxide generation in vitro may be partially involved in inhibition of Atg4B.<sup>29,30</sup> Three of the compounds (1502245, 1504078, and 1504080) are also reported hits in other HTS assays reported in the PubChem database, whereas another compound (201508) inhibits Shp2 tyrosine phosphatase, 33 showing promiscuous activity. In addition, these compounds have structures that are not promising for lead optimization, with 2 compounds representing polyphenols containing carboxylates (with or without internal cyclization to form lactone rings; 201508, 1502245) and 2 compounds representing stereoisomers of a natural product senoside glycosylated with pyranose sugars (1504078 and 1504080). Although none of these compounds is an attractive candidate for undertaking structure-activity relation (SAR) studies toward potent and selective autophagin inhibitors, these pilot screening results nevertheless provide proof-of-concept evidence that the HTS assay described here is capable of identifying compounds with

the potential for selectivity against autophagins relative to other classes of cysteine proteases.

Autophagy plays cytoprotective roles in some cancer-relevant contexts.<sup>29,30,32</sup> In this regard, inhibition of autophagy has been reported to sensitize some tumor cells to chemotherapy, suggesting that chemical inhibitors of autophagins may provide novel candidates for cancer drug discovery. Silencing Atg5 or Atg7 enhances apoptosis in chronic myeloid leukemia (CML) cells treated with imatinib mesylate (IM).34 Autophagy inhibitor, 3-MA, or siRNA against Atg7 also augments 5-fluorouracil (5-FU)-induced apoptosis in colon cancer cells in vitro and in vivo.35 Inhibiting autophagy with the nonselective PI3K inhibitor wortmannin (which crossreacts on the class III PI3K of autophagy, Vps34), as well as siRNAs targeting Vps34, Beclin1, or Atg5, appears to be synergistic with gossypol, a natural product that inhibits Bcl-2 family proteins, in human breast cancer cell MCF-7.36 In these cancer cell culture models, inhibition of autophagy synergizes with cytotoxic anticancer drugs, and thus it has been suggested that autophagy allows cancer cells to survive the stress of chemotherapy. Thus, we anticipate that Atg4B-specific inhibitors may have tumor growth inhibitory activity, as well as an ability to improve cytotoxic responses to chemotherapy. It is hoped that applications of the HTS assay reported here for screening large compound libraries will provide attractive chemical scaffolds for the pursuit of a novel class of anticancer agents based on inhibition of autophagy.

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