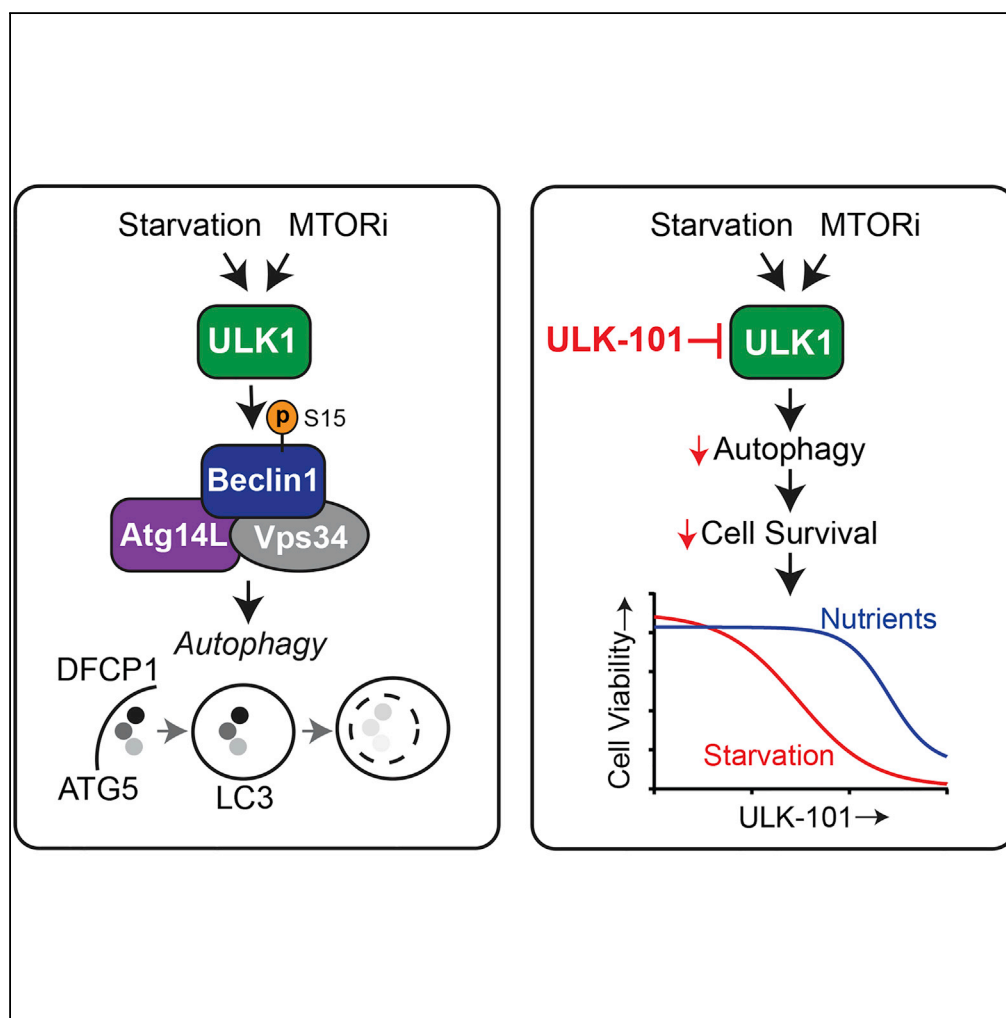


## Article

# A Potent and Selective ULK1 Inhibitor Suppresses Autophagy and Sensitizes Cancer Cells to Nutrient Stress



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Stephanie L.  
Celano, Abigail R.  
Solitro, ..., Stuart D.  
Shumway, Peter  
Fuller, Jeffrey P.  
MacKeigan

jeff.mackeigan@chm.msu.edu

#### HIGHLIGHTS

ULK-101 has improved  
potency and selectivity  
when compared with SBI-  
0206965

ULK-101 inhibits both the  
nucleation of autophagic  
vesicles and turnover

ULK-101 sensitizes KRAS-  
driven lung cancer cells to  
nutrient restriction

ULK-101 is a valuable  
molecular tool to study  
the function of ULK1 and  
autophagy

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## Article

# A Potent and Selective ULK1 Inhibitor Suppresses Autophagy and Sensitizes Cancer Cells to Nutrient Stress

Katie R. Martin,<sup>1</sup> Stephanie L. Celano,<sup>1</sup> Abigail R. Solitro,<sup>3</sup> Hakan Gunaydin,<sup>4</sup> Mark Scott,<sup>5</sup> Ronan C. O'Hagan,<sup>6</sup> Stuart D. Shumway,<sup>6</sup> Peter Fuller,<sup>7</sup> and Jeffrey P. MacKeigan<sup>1,2,3,8,\*</sup>

## SUMMARY

**In response to stress, cancer cells generate nutrients and energy through a cellular recycling process called autophagy, which can promote survival and tumor progression. Accordingly, autophagy inhibition has emerged as a potential cancer treatment strategy. Inhibitors targeting ULK1, an essential and early autophagy regulator, have provided proof of concept for targeting this kinase to inhibit autophagy; however, these are limited individually in their potency, selectivity, or cellular activity. In this study, we report two small molecule ULK1 inhibitors, ULK-100 and ULK-101, and establish superior potency and selectivity over a noteworthy published inhibitor. Moreover, we show that ULK-101 suppresses autophagy induction and autophagic flux in response to different stimuli. Finally, we use ULK-101 to demonstrate that ULK1 inhibition sensitizes KRAS mutant lung cancer cells to nutrient stress. ULK-101 represents a powerful molecular tool to study the role of autophagy in cancer cells and to evaluate the therapeutic potential of autophagy inhibition.**

## INTRODUCTION

Macroautophagy (hereafter autophagy) is an intracellular recycling pathway that generates biochemical building blocks through cytoplasmic breakdown (Klionsky, 2007). This process begins with nucleation of cup-shaped structures (phagophores) that grow into double-membrane autophagosomes as they sequester portions of cytosol. Fusion with lysosomes provides degradative enzymes to catabolize cargo into amino acids, lipids, and carbohydrates, which are then available for the cell to reuse. As an energy-efficient alternative to *de novo* synthesis, autophagy can promote cell survival during times of stress (Rabinowitz and White, 2010). For this reason, this process can contribute to the progression of certain cancers (e.g., by enabling survival in a nutrient-depleted tumor microenvironment) and also to therapeutic resistance. Autophagy appears to be particularly important in the survival and growth of KRAS-driven tumors, as evidenced in part by data from genetic mouse models (Eng et al., 2016; Guo et al., 2013, 2016; Karsli-Uzunbas et al., 2014; Rao et al., 2014). Autophagy inhibition is now being explored as a means to improve efficacy of existing cancer treatments, as well as a therapeutic strategy of its own (Chude and Amaravadi, 2017).

Autophagy induction is controlled primarily by the serine/threonine kinase, ULK1 (unc-51 like autophagy initiating kinase 1), a mammalian ortholog of yeast ATG1. ULK1 is part of a complex with binding partners ATG13 (autophagy related 13), RB1CC1 (RB1 inducible coiled-coil; also known as FIP200), and ATG101 (autophagy related 101) (Ganley et al., 2009; Mercer et al., 2009). Through this complex, ULK1 integrates upstream signals from both the mechanistic target of rapamycin complex 1 (mTORC1) nutrient-sensing and the AMP-activated protein kinase (AMPK) energy-sensing pathways to induce the production of early autophagic membranes (Ganley et al., 2009; Hosokawa et al., 2009; Jung et al., 2009; Kim et al., 2011). ULK1's essential role in autophagy has been shown in animals and mammalian cell culture systems where ULK1 depletion impairs autophagy (Chan et al., 2007; Cheong et al., 2011; Lee and Tournier, 2011). Although a second mammalian ATG1 ortholog, ULK2, also promotes autophagy (Lee and Tournier, 2011), loss of ULK1 alone is sufficient to abrogate autophagy in many cell types, underscoring its particularly important role (Chan et al., 2007; Zachari and Ganley, 2017).

ULK1 is now considered a promising target for autophagy inhibition because of its central role in pathway activation, druggable nature, and apparent selectivity for autophagy over other cellular functions. Accordingly, several small molecule inhibitors of ULK1 have recently been reported (Egan et al., 2015; Lazarus

<sup>1</sup>College of Human Medicine, Michigan State University, Grand Rapids, MI 49503, USA

<sup>2</sup>Van Andel Research Institute, Grand Rapids, MI 49503, USA

<sup>3</sup>Van Andel Institute Graduate School, Grand Rapids, MI 49503, USA

<sup>4</sup>Department of Modeling & Informatics, Merck & Co., Inc., Boston, MA 02115, USA

<sup>5</sup>Process Research & Development, Gilead Alberta ULC, Edmonton AB T6S 1A1, Canada

<sup>6</sup>Department of Oncology, Merck & Co., Inc., Boston, MA 02115, USA

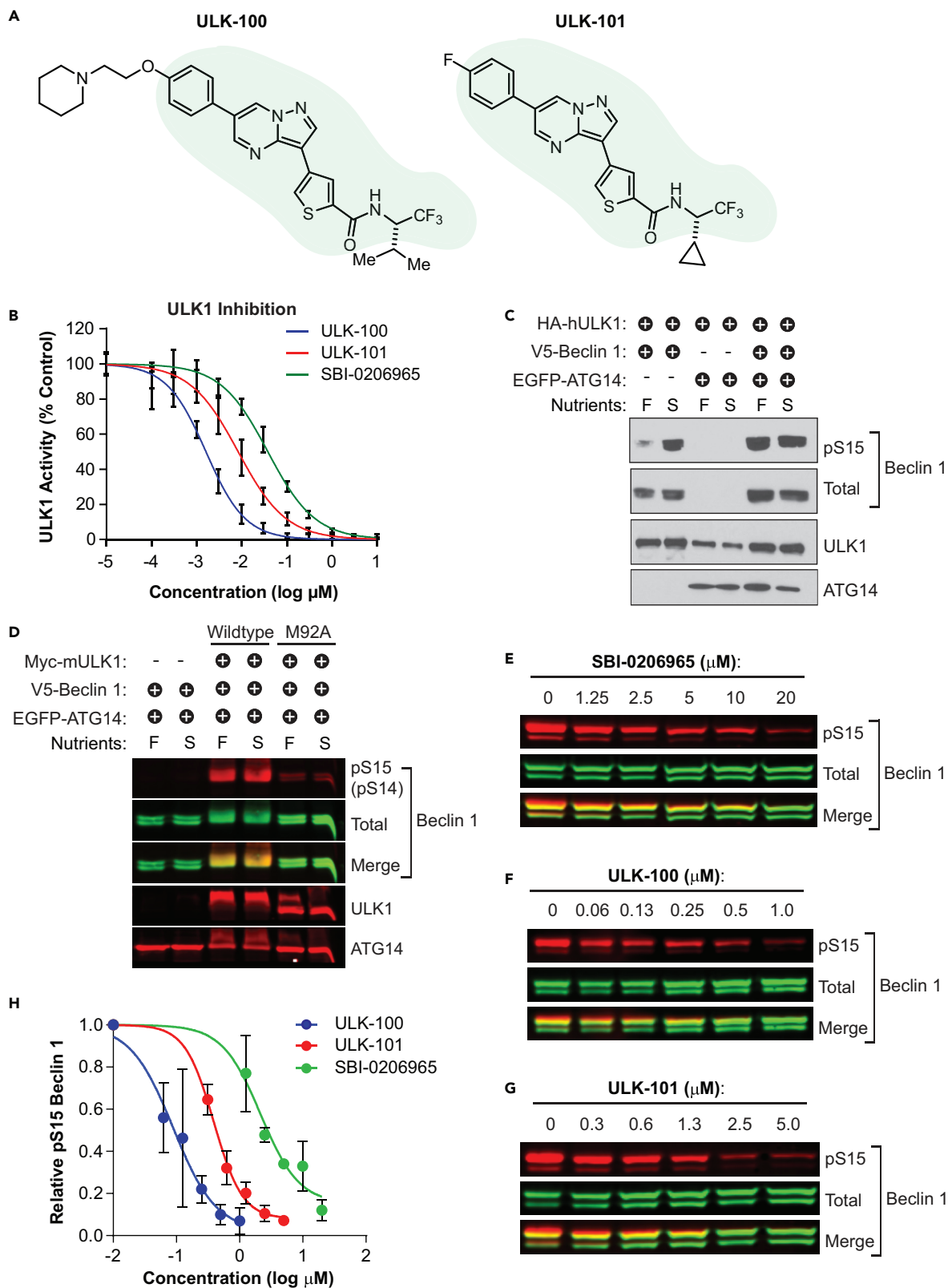
<sup>7</sup>Discovery Chemistry, Merck & Co., Inc., Boston, MA 02115, USA

<sup>8</sup>Lead Contact

\*Correspondence: jeff.mackeigan@chm.msu.edu

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**Figure 1. ULK-100 and ULK-101 Potently Inhibit ULK1 *In Vitro* and in Cells**

(A) The chemical structures of ULK-100 and ULK-101 are shown with the shared scaffold shaded.  
(B) ULK1 activity was measured in the presence of ULK-100 (blue), ULK-101 (red), or SBI-0206965 (green) at half-log dilutions from top concentrations of 10  $\mu$ M. All concentrations were tested in 8 replicates with the exception of the two highest and lowest concentrations, which were performed in 4 replicates. Data are represented as mean activity normalized to control (0  $\mu$ M inhibitor)  $\pm$  SD. Solid lines represent IC<sub>50</sub> curves fit by non-linear regression.  
(C and D) 293FT lysates expressing HA-hULK1, Myc-mULK1 (wild-type or M92A), V5-Beclin 1, and/or EGFP-ATG14 were treated for 1 hr with full growth (F) or nutrient starvation (S) media and (C) probed by immunoblotting with the indicated antibodies. In (D), membranes were imaged by Odyssey (total and pS15 detected from same Beclin 1 band). S14 is the murine (mULK1) residue number corresponding to human (hULK1) S15.  
(E–G) 293FT cells expressing HA-ULK1, V5-Beclin 1, and EGFP-ATG14 were treated with the indicated concentrations of SBI-0206965 (E), ULK-100 (F), or ULK-101 (G) for 1 hr. Lysates were probed with the indicated antibodies and imaged using an Odyssey imager. Representative blots from 3 biological replicates per inhibitor are shown.  
(H) Relative pS15-BECLIN 1 was quantified as the pS15-Beclin 1 signal divided by total Beclin 1 signal, each normalized to the vehicle (0  $\mu$ M inhibitor). Symbols represent means from 3 biological replicates  $\pm$  SEM. EC<sub>50</sub> curves (solid lines) were generated by non-linear regression using variable slopes.

et al., 2015; Lazarus and Shokat, 2015; Petherick et al., 2015; Wood et al., 2017). These compounds have provided insight into ULK1's structure and validated ULK1 inhibition as an effective means for suppressing autophagy, while also providing proof of concept for small molecule targeting of this enzyme. That being said, existing ULK1 inhibitors are limited individually in their potency, selectivity, or evidence of cellular activity.

Here, we describe two small molecule inhibitors, ULK-100 and ULK-101, which show strong activity toward ULK1 both *in vitro* and in cells. We establish improved potency and selectivity of ULK-101 compared with the published ULK1 inhibitor, SBI-0206965. Moreover, we demonstrate that ULK-101 blocks autophagy induction and suppresses autophagic flux both constitutively and in response to starvation and mTOR inhibition. Last, we discover that ULK-101 sensitizes KRAS-driven lung cancer cells to nutrient restriction. Taken together, ULK-101 is a valuable molecular tool to interrogate the cellular function of ULK1 and autophagy and to evaluate the therapeutic potential of autophagy inhibition at the level of the ULK1 complex and autophagy initiation.

**RESULTS****Small Molecules Potently Inhibit ULK1 *In Vitro* and in Cells**

To identify small molecule ULK1 inhibitors, we searched existing pharmaceutical data for compounds that showed activity against ULK1 in selectivity screening. This process led us to two closely related molecules, ULK-100 and ULK-101, which share a common scaffold and differ in the two flanking R-groups (Figure 1A). We confirmed that both inhibit ULK1 directly *in vitro* with an IC<sub>50</sub> of 1.6 nM (95% confidence interval [CI]: 1.5–1.8 nM) for ULK-100 and 8.3 nM (95% CI: 7.2–9.6 nM) for ULK-101 (Figure 1B; Table 1). For comparison, we determined the IC<sub>50</sub> of a recently reported ULK1 inhibitor, SBI-0206965 (Egan et al., 2015), to be 38 nM (95% CI: 34–42 nM) (Figure 1B; Table 1).

ULK1 promotes autophagy through phosphorylation of a protein complex that includes the lipid kinase, PIK3C3 (phosphatidylinositol 3-kinase catalytic subunit type 3), and its binding partners, ATG14 (autophagy related 14) and Beclin 1. Specifically, when Beclin 1 is phosphorylated at Ser15 by ULK1, it increases the activity of PIK3C3 to produce phosphoinositide-3-phosphate (PtdIns3P), a phospholipid required for the nucleation of autophagic membranes (Russell et al., 2013). To determine whether ULK-100 and ULK-101 inhibit ULK1 in cells, we evaluated the phosphorylation of Beclin 1 at Ser15. We exogenously expressed both Beclin 1 and ULK1 and found that Ser15 phosphorylation was substantially increased by nutrient starvation, a stimulus known to activate ULK1 and induce autophagy (Figure 1C) (Cheong et al., 2011). Furthermore, we found that co-expression of ATG14 caused phosphorylation of Ser15 that was no longer dependent on starvation (Figure 1C). Importantly, Beclin 1 Ser15 phosphorylation was ablated by the expression of a kinase-dead ULK1 mutant (Jung et al., 2009), confirming that this phosphorylation specifically required the catalytic activity of ULK1 and could serve as a cellular readout of ULK1 kinase activity (Figure 1D).

We treated cells expressing ULK1, Beclin 1, and ATG14 with concentration gradients of ULK-100, ULK-101, or SBI-0206965 for 1 hr and measured Ser15 phosphorylation by quantitative immunoblotting. All three ULK1 inhibitors reduced Ser15 phosphorylation in a concentration-dependent manner (Figures 1E–1G), with SBI-0206965 showing a cellular EC<sub>50</sub> of 2.4  $\mu$ M in this assay, compared with 390 nM for ULK-101 and just 83 nM for ULK-100 (Figure 1H; Table 1). Taken together, these data suggest that ULK-101 and ULK-100 are more potent ULK1 tool compounds than SBI-0206965 both *in vitro* and in cells.

	SBI-0206965	ULK-100	ULK-101
ULK1 IC <sub>50</sub> (nM)	38	1.6	8.3
ULK2 IC <sub>50</sub> (nM)	212	2.6	30
Cellular EC <sub>50</sub> (nM)	2,400	83	390

**Table 1. Biochemical IC<sub>50</sub> and Cellular EC<sub>50</sub> for ULK1 Inhibitors**

### ULK-101 Has a Desirable Kinome Selectivity Profile

ULK2 is the second mammalian ortholog of yeast ATG1 with a similar function in autophagy as ULK1 (Lee and Tournier, 2011); therefore, we reasoned that inhibiting ULK2 would be important for an ULK1 inhibitor intended to block autophagy. We tested ULK-100 and ULK-101, along with SBI-0206965, for the ability to inhibit ULK2 kinase activity *in vitro* and found that all three molecules show nanomolar ULK2 IC<sub>50</sub> values (Figure 2A; Table 1). Similar to the results obtained for ULK1, ULK-100 (ULK2 IC<sub>50</sub> 2.6 nM) showed the greatest potency followed by ULK-101 (ULK2 IC<sub>50</sub> 30 nM) and SBI-0206965 (ULK2 IC<sub>50</sub> 212 nM).

Next, we wanted to understand the kinome-wide selectivity profiles of each inhibitor. For this, we determined their ability to inhibit 327 recombinant human kinases *in vitro* using radiometric activity assays. Each kinase was screened in duplicate with a single concentration of compound that achieved almost identical ULK1 inhibition for SBI-0206965 and ULK-101 (74% and 73% inhibition, respectively), and slightly better ULK1 inhibition for ULK-100 (88% inhibition). To compare the selectivity of the three compounds, we normalized the inhibition of each kinase to that of ULK1 (Table S1). Overall, ULK-101 showed the cleanest kinome-wide profile (Figure 2B). SBI-0206965 and ULK-100 inhibited 17 or 18 kinases at least 75% as well as they inhibited ULK1, respectively, whereas ULK-101 inhibited just four other kinases at this level (Figure 2C). We visualized these on the human kinase phylogenetic tree and found that the off-targets of both SBI-0206965 and ULK-100 were diversely distributed (Figures 2D and 2E), whereas three of the four off-targets of ULK-101 were CAMK family members (Figure 2F). To fully understand the relative inhibition of the closest ULK-101 off-targets, we determined the IC<sub>50</sub> for DRAK1 to be 14 nM and that of MNK2 to be 22 nM (compared with 8.3 nM for ULK1). From this study, we concluded that ULK-101 offers superior selectively properties than both SBI-0206965 and ULK-100, and therefore we prioritized this inhibitor for further investigation.

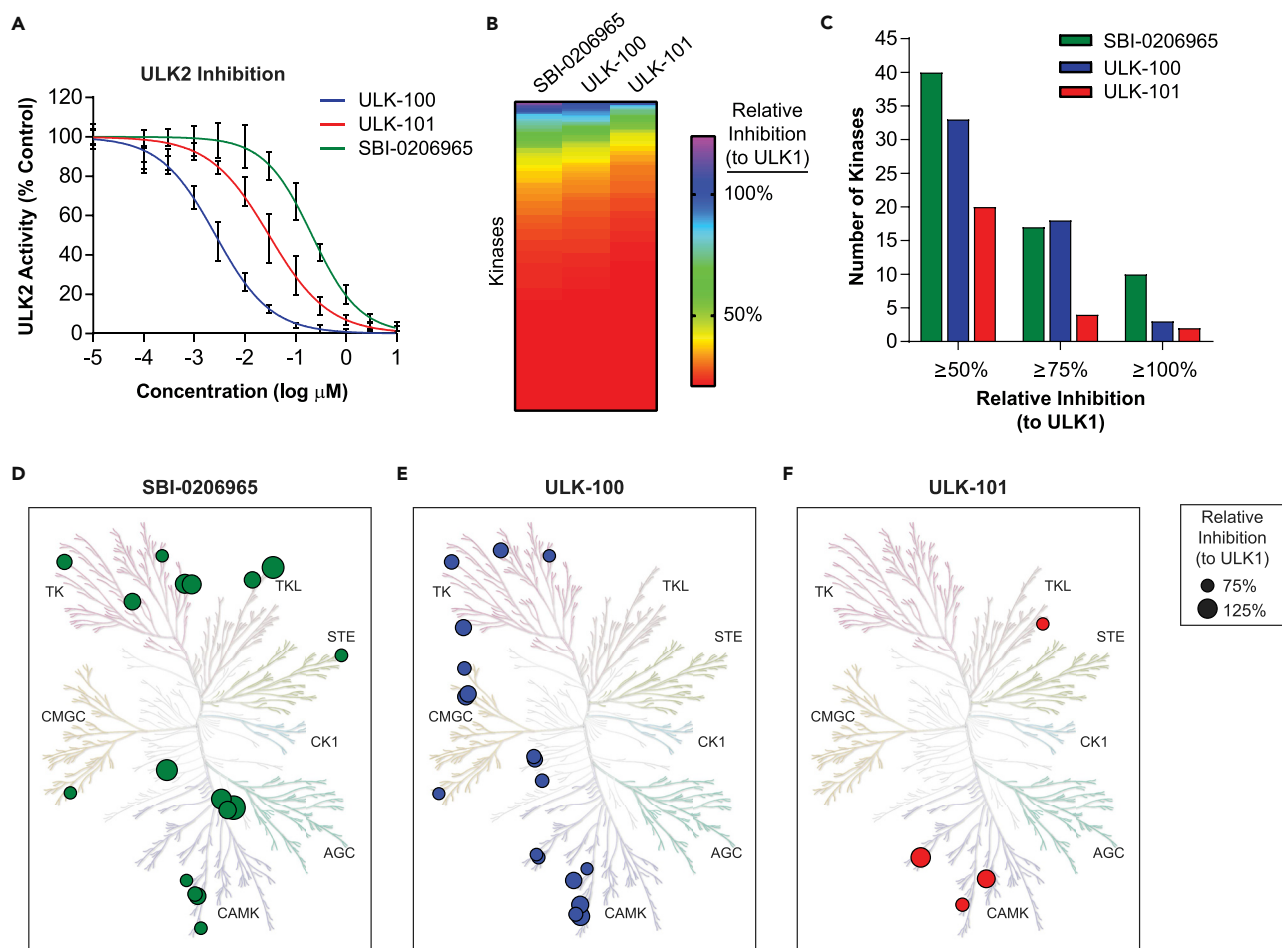
### ULK-101 Reduces the Nucleation of Autophagic Vesicles

When ULK1 phosphorylates Beclin 1 at Ser15, it increases the formation of PtdIns3P by the autophagic PIK3C3 complex (Russell et al., 2013). This PtdIns3P production occurs in rough endoplasmic reticulum microdomains called omegasomes, which serve as platforms for the formation of early autophagic membranes (Axe et al., 2008). To determine whether ULK-101 suppressed autophagy induction, we stably expressed the omegasome marker, EGFP-DFCP1, in U2OS cells and monitored omegasome formation by live-cell fluorescent microscopy. We treated cells for 2.5 hr with AZD8055, a catalytic mTOR inhibitor that strongly induces autophagy in U2OS cells (Martin et al., 2013) and observed that the abundance of DFCP1-positive puncta increased over 3-fold (Figures 3A and 3B). Co-treatment of cells with 5 μM ULK-101 completely abrogated the formation of DFCP1-positive structures induced by AZD8055 treatment, consistent with the loss of Beclin 1 phosphorylation (Figures 3A and 3B).

Omeasomes support the formation of phagophores, cup-shaped autophagic membranes marked specifically by the ubiquitin-like ATG12-ATG5-ATG16L complex (Axe et al., 2008; Mizushima et al., 2003). To determine whether ULK-101 also reduced the formation of phagophores, we immunostained U2OS cells for endogenous ATG12. Indeed, we found that AZD8055 treatment resulted in distinct ATG12-positive puncta and that co-treatment with ULK-101 strongly suppressed this (Figure 3C). From these experiments, we concluded that ULK-101 limits AZD8055-induced omegasome and phagophore formation.

### Autophagic Turnover Is Suppressed by ULK-101 in Response to Multiple Stimuli

Autophagy is a dynamic membrane process in which vesicles form, grow, enclose, and fuse with lysosomes for degradation. MAP1LC3B (microtubule-associated proteins 1A/1B light chain 3B; hereafter LC3B) is a ubiquitin-like protein that becomes conjugated to the earliest autophagic membranes and remains on vesicles in the lysosome, where it is degraded along with sequestered cargo (Tanida et al., 2005). As such, its



**Figure 2. Selectivity Profiles of ULK1 Inhibitors**

(A) ULK2 activity was measured in the presence of ULK-100 (blue), ULK-101 (red), or SBI-0206965 (green) at half-log dilutions from top concentrations of 10  $\mu\text{M}$ . All concentrations were tested in 8 replicates with the exception of the two highest and lowest concentrations, which were performed in 4 replicates. Data are represented as activity normalized to control (0  $\mu\text{M}$  inhibitor)  $\pm$  SD. Solid lines represent IC<sub>50</sub> curves fit by non-linear regression.

(B) The relative inhibition of human kinases by each compound is shown in a rainbow scale from low (red) to high (purple). Kinases are ordered by their relative inhibition within each compound.

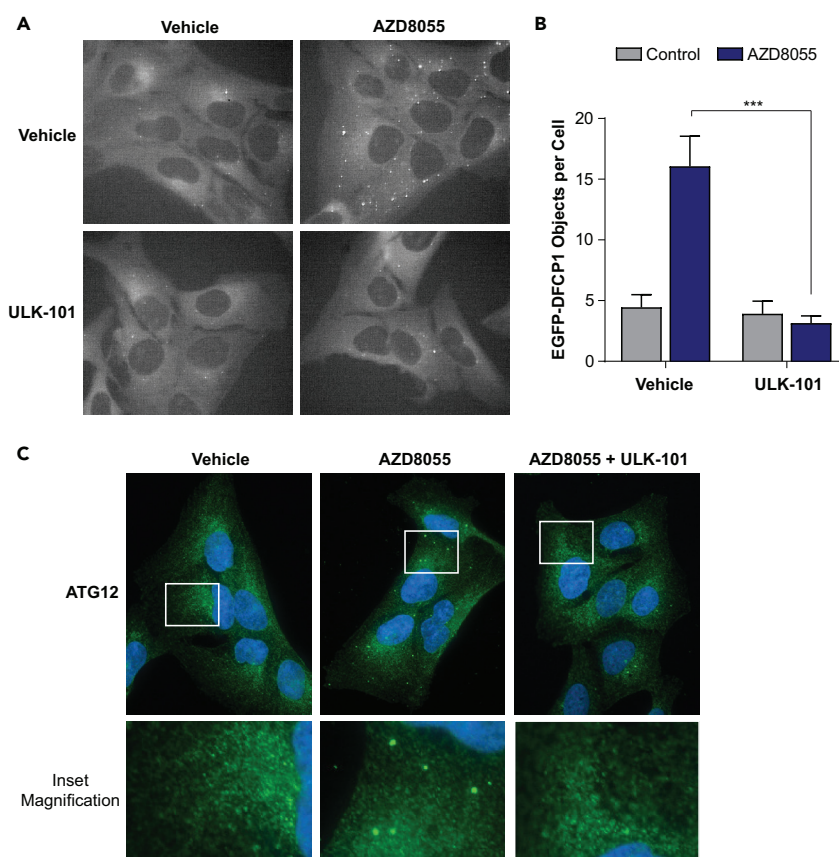
(C) The number of non-ULK1 kinases (of 326 surveyed) inhibited by at least 50% (left), 75% (middle), or 100% (right) the level of ULK1 is plotted for SBI-0206965 (green), ULK-100 (blue), and ULK-101 (red).

(D–F) Kinases inhibited by at least 75% the level of ULK1 by SBI-0206965 (green; D), ULK-100 (blue; E), and ULK-101 (red; F) are identified on human kinome phylogenetic trees. Symbols are sized according to their relative inhibition, and major kinase groups identified. TK, tyrosine kinase; TKL, tyrosine kinase-like; STE, homologs of yeast Sterile 7, Sterile 11, Sterile 20 kinases; CK1, casein kinase 1; AGC, containing PKA, PKG, PKC families; CAMK, calcium/calmodulin-dependent protein kinase; CMGC, containing CDK, MAPK, GSK3, CLK families. Figures generated using KinMap Beta, and illustrations reproduced courtesy of Cell Signaling Technology.

See also [Table S1](#).

turnover can be measured to indicate the overall rate of autophagy (Klionsky et al., 2016). To do this, we blocked lysosomal function with bafilomycin A1 (BafA1), a proton pump inhibitor, for a short period. We then measured the accumulation of membrane-bound LC3B (detected as LC3B-II by immunoblotting) and compared with the amount observed in the absence of BafA1. We found that a 3-hr treatment with ULK-101 reduced BafA1-induced LC3B-II accumulation in U2OS cells in a concentration-dependent manner (Figure 4A). The EC<sub>50</sub> value for this inhibition was approximately 700 nM (Figure 4B). To validate this phenotype, we quantified autophagic puncta in EGFP-LC3B-expressing U2OS cells using fluorescent microscopy (Figure 4C). Again, ULK-101 blocked the BafA1-induced accumulation of LC3B-positive vesicles (a 6-fold reduction from the vehicle control), suggesting a nearly complete inhibition of autophagic activity (Figure 4D).





### Figure 3. ULK-101 Suppresses the Induction of Early Autophagy

(A) U2OS cells stably expressing EGFP-DFCP1 were treated for 2.5 hr with vehicle control or 100 nM AZD8055 with or without 5  $\mu$ M ULK-101 and imaged live by fluorescent microscopy. Representative images are shown (grayscale of green fluorescein isothiocyanate channel).

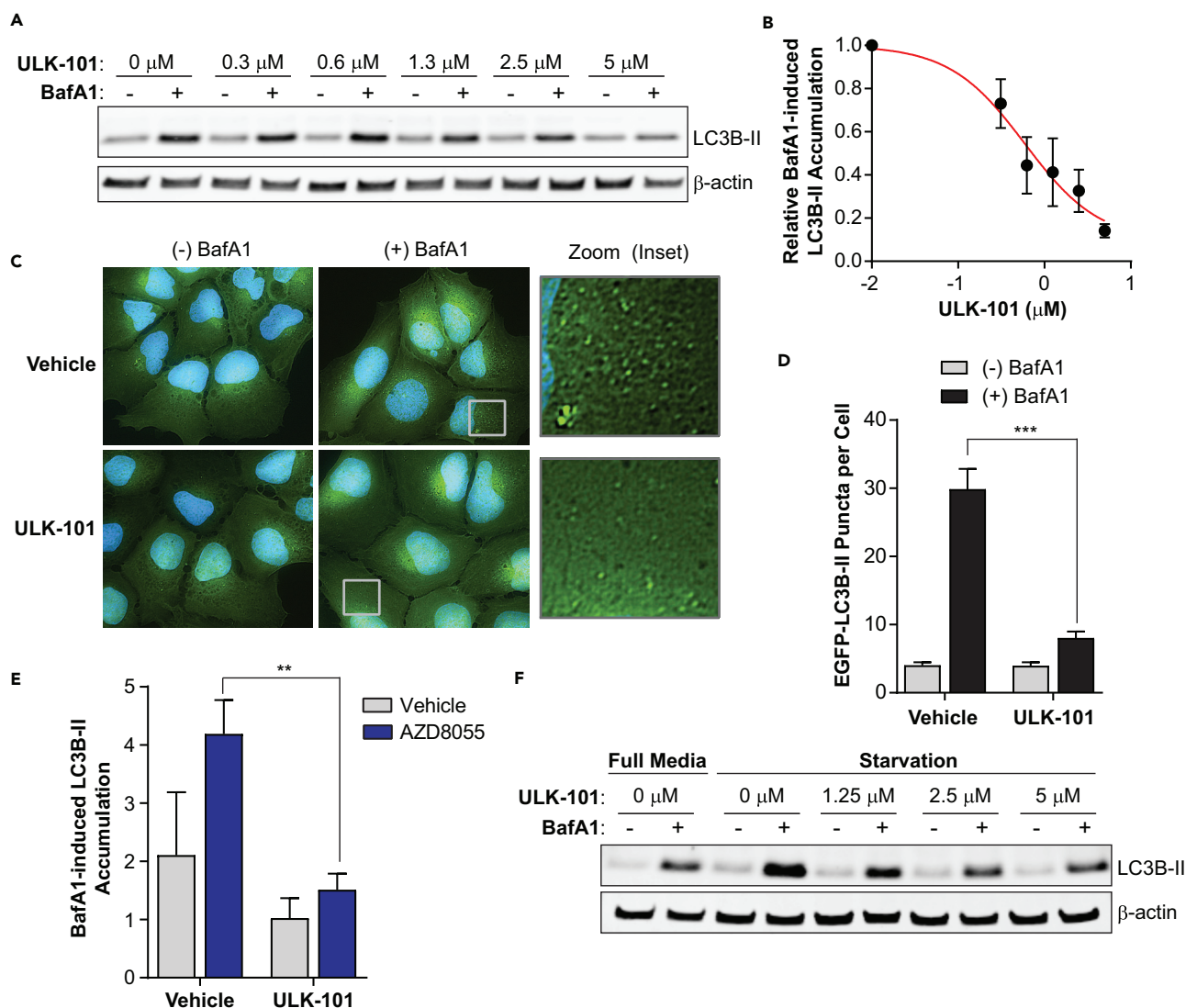
(B) EGFP-DFCP1 objects per cell were quantified from 20 to 25 cells per condition. Data are represented as mean  $\pm$  SEM. Two-tailed, unpaired t test; \*\*\* $p < 0.001$ .

(C) U2OS cells were treated for 2.5 hr with vehicle control or 100 nM AZD8055 with or without 5  $\mu$ M ULK-101 and then immunostained for endogenous ATG12 (green). Nuclei (blue) were counterstained. Representative images are shown. Lower panels are 3.3 $\times$  magnifications of upper panel insets.

Having established that ULK-101 suppressed basal autophagic turnover, we next wanted to determine whether it also reduced stimulus-induced autophagy. To test this, we again treated cells with AZD8055 and found that BafA1-induced LC3B-II accumulation increased over 2-fold within 1 hr, an effect that was negated by ULK-101 (Figure 4E). We then stimulated autophagy by starving cells of nutrients, including amino acids and growth factors, for 3 hr in the presence or absence of ULK-101. Again, ULK-101 reduced BafA1-induced LC3B-II accumulation in a concentration-dependent manner (Figure 4F). Taken together, ULK-101 suppresses both basal and induced autophagy, including formation of early autophagic structures and autophagic flux.

### Nutrient Stress Sensitizes Cells to ULK-101

Finally, we wanted to explore the therapeutic potential of ULK-101 by determining its effects on cell viability. Specifically, we hypothesized that ULK-101 would suppress cell survival during nutrient withdrawal when cells are most dependent on autophagy. To test this hypothesis, we optimized a starvation media that induced autophagy on a longer timescale without compromising cell viability (Figure S1). This media, which we called Optistarve (OS), contained reduced (but not ablated) levels of amino acids, serum, glucose, glutamine, and vitamins compared with full growth media (FM) (see Transparent Methods). To determine the effectiveness of ULK-101 in cells subjected to these different nutrient conditions, we performed a clonogenic survival experiment in which we treated cells with a concentration



**Figure 4. ULK-101 Reduces Autophagic Turnover**

(A) U2OS cells were treated for 3 hr with the indicated concentrations of ULK-101, with (+) or without (–) 100 nM BafA1 for the final 1.5 hr. Lysates were probed for LC3B and  $\beta$ -actin as a loading control and imaged. A representative from 3 biological replicates is shown.

(B) Relative LC3B-II signal was determined by dividing the LC3B-II signal by the  $\beta$ -actin signal. The difference between (+) and (–) BafA1 bands was calculated for each ULK-101 concentration, and this value was plotted (normalized to 1.0 for the vehicle control). Symbols represent the mean of 3 biological experiments  $\pm$  SEM. The red line is an EC<sub>50</sub> curve fit by non-linear regression.

(C) EGFP-LC3B (green) was imaged in U2OS cells treated for 3 hr with vehicle or 5  $\mu$ M ULK-101 with (+) or without (–) 100 nM BafA1 added for the final 1.5 hr. Green, EGFP-LC3B; blue, Hoechst-33342 (nuclei). Right panels are 5 $\times$  magnifications of insets (boxes).

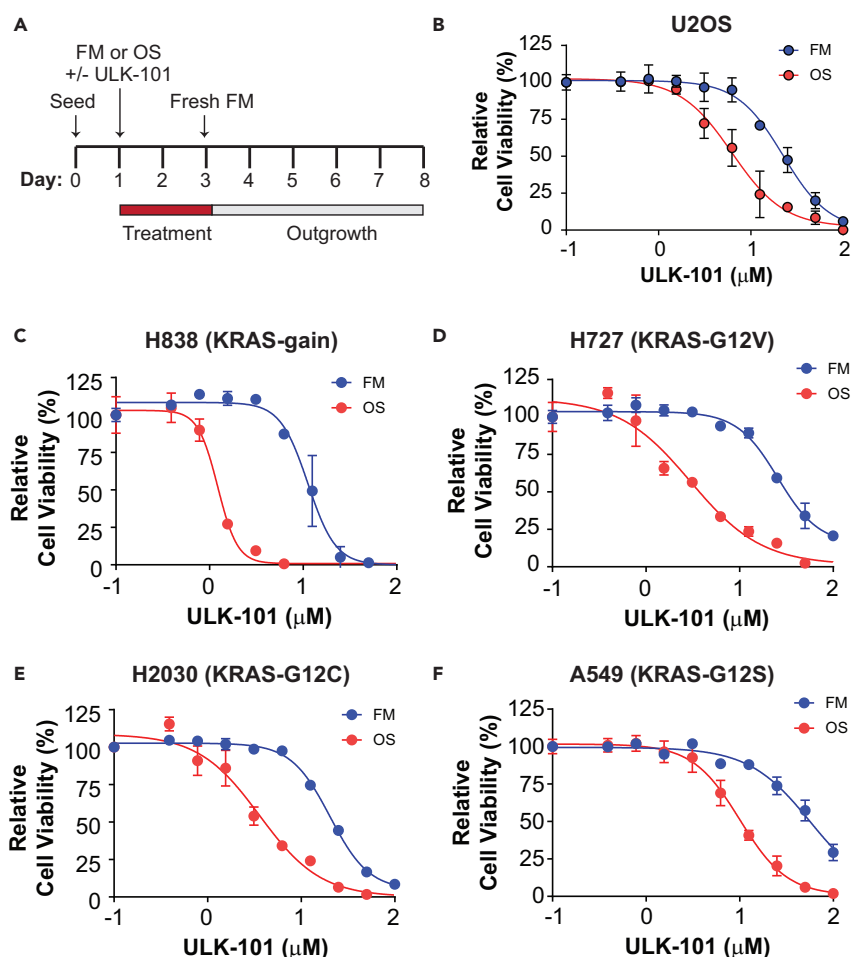
(D) The number of EGFP-LC3B puncta per cell was quantified from images in (C) ( $\geq 70$  cells per condition). Data are represented as mean  $\pm$  SEM. Two-tailed, unpaired t test; \*\*\* $p < 0.001$ .

(E) U2OS cells were treated with vehicle control (gray bars) or 100 nM AZD8055 (blue bars) supplemented with or without 5  $\mu$ M ULK-101 for 3 hr. Vehicle control or 100 nM BafA1 was added for the last 1.5 hr, and the relative amount of BafA1-induced LC3B-II (normalized to  $\beta$ -actin) was quantified as in (B). Data are represented as mean of 3 biological replicates  $\pm$  SEM. Two-tailed, unpaired t test; \*\* $p < 0.01$ .

(F) U2OS cells were treated with full growth media or an Hank's balanced salt solution (HBSS)-based starvation media for 3 hr. ULK-101 was added at the indicated concentrations with (+) or without (–) 100 nM BafA1 for the final 1.5 hr. Lysates were probed for LC3B and  $\beta$ -actin as a loading control and imaged.

gradient of ULK-101 (or vehicle control) for 2 days during culture with either FM or OS. Following this 2-day treatment, media was washed and replaced with drug-free FM in a 5-day outgrowth (recovery) phase (Figure 5A). We then measured cell viability and generated relative cell viability curves. Consistent with our hypothesis, we found that ULK-101 was nearly four times as effective in reducing survival of





**Figure 5. ULK-101 Reduces Viability of Nutrient-Restricted Cancer Cells**

(A) Clonogenic survival experimental design. Cells were seeded for 24 hr before a 2-day treatment with FM or OS media in the presence or absence of ULK-101. Thereafter, media were washed and cells treated with drug-free FM for a 5-day recovery period before cell viability was measured.

(B) Data from clonogenic survival assay with U2OS cells. Symbols represent means of 3 technical replicates  $\pm$  SD. Solid lines are  $EC_{50}$  curves fit by non-linear regression. Blue, FM; red, OS. Cell viability normalized to the 0  $\mu$ M ULK-101 concentration.

(C–F) Clonogenic survival assay data for non-small-cell lung cancer lines (cell line and KRAS mutation indicated above each graph). Symbols represent means of 3 technical replicates  $\pm$  SD. Solid lines are  $EC_{50}$  curves fit by non-linear regression. Blue, FM; red, OS. Cell viability normalized to the 0  $\mu$ M ULK-101 concentration.

See also [Figure S1](#) and [Table S2](#).

osteosarcoma U2OS cells when cultured in OS ( $EC_{50}$  6.3  $\mu$ M) when compared with FM ( $EC_{50}$  22.3  $\mu$ M) ([Figure 5B](#)).

To determine whether this phenotype was common among other cell lines, we examined non-small-cell lung cancer (NSCLC) cell lines for ULK-101 sensitivity. We chose this model because oncogenic *KRAS*, which is found in 15%–25% of NSCLC cell lines, has been suggested to promote autophagy-dependent cell survival, and autophagy contributes to lung cancer progression in animal models ([Guo et al., 2011, 2013](#); [Lock et al., 2011, 2014](#)). Indeed, we found that *KRAS* mutant or amplified NSCLC lines showed at least a 5-fold increase in ULK-101 sensitivity when cultured in OS compared with FM ([Figures 5C–5F](#); [Table S2](#)).

## DISCUSSION

Autophagy is a conserved recycling process that has emerged as a critical effector of both oncogenes and tumor suppressors and a potent regulator of cancer cell fate ([Liu and Ryan, 2012](#); [Rosenfeldt and Ryan, 2009](#)).

Although autophagy is carried out by the coordinated activity of more than 30 proteins, just a few are enzymes with clear drug-targeting potential. Among these is ULK1, which has garnered interest as a small molecule target given its essential and early role in the pathway. Here, we have presented ULK-101 as a potent and selective ULK1 inhibitor and demonstrated its ability to suppress autophagy in human cells.

ULK-101 joins at least six other ULK1 inhibitors reported since 2015. The Shokat laboratory has developed a series of ULK1-targeted compounds that have provided valuable insights into the structure of ULK1, despite limited selectivity and potency in cells (Lazarus et al., 2015; Lazarus and Shokat, 2015). Two other notable inhibitors were found by mining pharmaceutical data for compounds with activity against ULK1, analogous to our approach. SBI-0206965 was developed from a FAK inhibitor and shown to reduce Beclin 1 Ser15 phosphorylation in cells (Egan et al., 2015). This compound was reported as selective, based primarily on a large-scale competition binding assay; however, our direct comparison using *in vitro* kinase assays found ULK-101 to be considerably more selective than SBI-0206965. MRT68921, derived from a TBK1 inhibitor, inhibited ULK1 potently *in vitro* and strongly suppressed autophagy in cells, with 1  $\mu$ M shown to block BafA1-induced LC3-II accumulation in nutrient-starved murine embryonic fibroblasts (Petherick et al., 2015). Although the authors screened 80 other kinases for inhibition by MRT68921, it is difficult to compare the selectivity profiles of MRT68921 and ULK-101. ULK-101 was screened against 327 kinases. Of interest, MRT68921 cross-reacts with AMPK, which may represent a therapeutic liability given the broad tumor suppressive functions of AMPK signaling. Interestingly, whereas AMPK was also inhibited by ULK-100 *in vitro*, it was spared by ULK-101 (Table S1). Finally, a study employing *in silico* screening and structure-activity relationship analyses identified potent indazole-derived ULK1 inhibitors, although their selectivity and activity in cells remains to be determined (Wood et al., 2017).

A major unresolved issue in the autophagy field concerns the genetic and environmental contexts in which autophagy promotes tumor growth and represents a therapeutic target. Here, we have used ULK-101 to show that nutrient-stressed cells may be particularly susceptible to ULK1 inhibition. SBI-0206965 was similarly found to increase cell death in nutrient-starved cells or in those with chemical mTORC1 inhibition (Egan et al., 2015). These findings are consistent with other studies in which autophagy inhibition was particularly effective in cells deprived of nutrients (Eng et al., 2016; Guo et al., 2016). Together, this suggests that nutrient depletion caused by rapid tumor growth may create a unique vulnerability to autophagy inhibition. Finally, although we found that several lung cancer cell lines with oncogenic *KRAS* were sensitive to ULK-101, future work is required to fully define the genetic backgrounds in which targeting ULK1 and autophagy will be effective.

### Limitations of the Study

Interest is mounting in developing novel therapeutics that can modulate the fundamental mechanisms of human disease, including autophagy. Despite encouraging research progress, only a limited number of compounds that target autophagy are developed beyond basic research. Accordingly, we aim to move these autophagy inhibitors through preclinical development. ULK-100 and ULK-101 have performed well *in vitro*, but these compounds require further validation *in vivo* to proceed with preclinical testing. In addition, ULK1 targeting as a therapeutic mechanism may not be effective in all genetic or environmental contexts, and further research is needed to identify when this strategy would be most effective.

### METHODS

All methods can be found in the accompanying [Transparent Methods supplemental file](#).

### SUPPLEMENTAL INFORMATION

Supplemental Information includes Transparent Methods, one figure, and two tables and can be found with this article online at <https://doi.org/10.1016/j.isci.2018.09.012>.

### ACKNOWLEDGMENTS

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## AUTHOR CONTRIBUTIONS

Conceptualization, K.R.M., R.C.O., and J.P.M.; Methodology, K.R.M., S.L.C., A.R.S., H.G., M.S., S.D.S., P.F., and J.P.M.; Validation, K.R.M., S.L.C., and A.R.S.; Formal Analysis, K.R.M., S.L.C., A.R.S., and J.P.M.; Investigation, K.R.M., S.L.C., and J.P.M.; Resources, K.R.M., S.L.C., S.D.S., P.F., and J.P.M.; Writing – Original Draft, K.R.M., S.L.C., and J.P.M.; Writing – Review & Editing, K.R.M., S.L.C., A.R.S., R.C.O., S.D.S., P.F., and J.P.M.; Visualization, K.R.M., S.L.C., and J.P.M.; Supervision, K.R.M., S.D.S., P.F., and J.P.M.; Project Administration, R.C.O., S.D.S., P.F., and J.P.M.; Funding Acquisition, R.C.O. and J.P.M.

## DECLARATION OF INTERESTS

The authors declare no competing interests.

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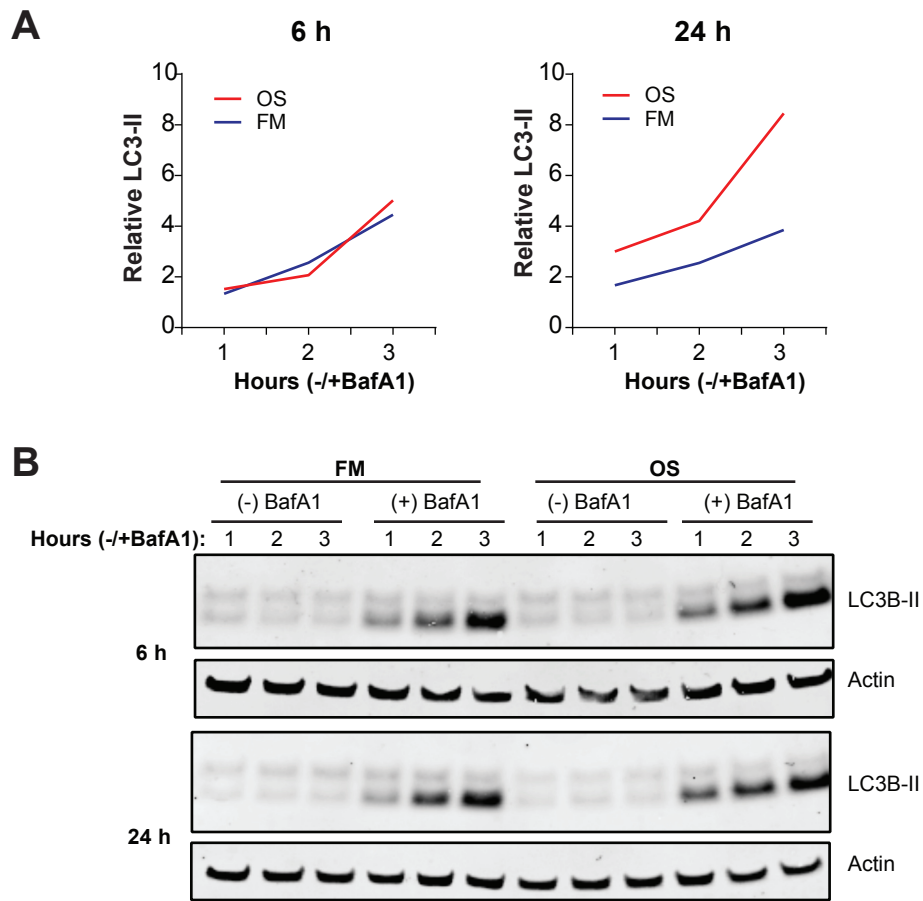
**ISCI, Volume 8**

**Supplemental Information**

**A Potent and Selective ULK1 Inhibitor  
Suppresses Autophagy and Sensitizes  
Cancer Cells to Nutrient Stress**

**Katie R. Martin, Stephanie L. Celano, Abigail R. Solitro, Hakan Gunaydin, Mark Scott, Ronan C. O'Hagan, Stuart D. Shumway, Peter Fuller, and Jeffrey P. MacKeigan**

**Figure S1**





**Figure S1. Optimized a starvation media that induces autophagy, Related to Figure 5.** U2OS cells were treated for 6 hours or 24 hours with full media (FM) or Optistarve (OS) and BafA1 (+) or a vehicle control (-) added for the final 1, 2, or 3 hours. Lysates were probed by immunoblotting for LC3B and  $\beta$ -actin as a loading control. (A) The amount of actin-normalized LC3B-II accumulating with BafA1 treatment was determined and plotted by the indicated times of BafA1 treatment (blue: FM; red: OS). (B) The immunoblots for LC3B and  $\beta$ -actin are shown.

**Table S2**

<b>Cell Line</b>	<b>Gain/Mutation</b>	<b>FM EC50 (<math>\mu</math>M)</b>	<b>OS EC50 (<math>\mu</math>M)</b>	<b>Fold-Change FM / OS</b>
H838	<i>KRAS (gain)</i>	11.3	1.2	9.2
H727	<i>KRAS (G12V)</i>	25.6	3.0	8.6
H2030	<i>KRAS (G12C)</i>	20.3	3.6	5.7
A549	<i>KRAS (G12S)</i>	56.8	10.0	5.7

**Table S1. Kinome selectivity data, Related to Figure 2.** The enzymatic activity of human recombinant kinases was measured after treatment with ULK1 inhibitors at the indicated concentrations using radiometric assays. The percent activity remaining (compared to vehicle control) is indicated, as is the percent inhibition, calculated by subtracting the % activity remaining from 100%. The relative inhibition compared to ULK1 is also shown (where relative inhibition (%) = (kinase % inhibition / ULK1 % inhibition) \* 100) within each compound. ULK1 data is indicated in red and all other kinases are alphabetized.

**Table S2. ULK-101 sensitivity in lung cancer cells under nutrient stress, Related to Figure 5.** The ULK-101 EC<sub>50</sub> in cell lines cultured in FM or OS (according to the experimental design in Figure 5A) are shown, along with fold-change, calculated as FM EC<sub>50</sub> divided by OS EC<sub>50</sub>.

## TRANSPARENT METHODS

### Chemical Synthesis

ULK-100 and ULK-101 were provided by Merck & Co., Inc. and previously synthesized according to Sloman *et al.*, 2016 (Sloman *et al.*, 2016). SBI-0206965 was provided by Merck & Co., Inc. and prepared according to Egan *et al.*, 2015 (Egan *et al.*, 2015).

### Reagents and Antibodies

Bafilomycin A1 (BafA1) was purchased from AG Scientific (#B1183). AZD8055 was purchased from Selleck Chemicals (#S1555). pSer15-BECLIN 1 (#13825), total BECLIN 1 (#4122), ULK1 (#8054), ATG12 (#2010), and  $\beta$ -Actin (#3700) antibodies were purchased from Cell Signaling Technologies. LC3B antibody was purchased from Sigma-Aldrich (#L7543). ATG14 antibody was purchased from MBL International (#PD026). HRP-linked rabbit (#NA931) and mouse (#NA934) secondary antibodies were purchased from GE Healthcare. IRDye 800CW goat anti-mouse IgG (#926-32210) and IRDye 680RD goat anti-rabbit IgG (#926-68071) were purchased from LI-COR Biosciences. AF488-conjugated goat anti-rabbit IgG was purchased from Invitrogen (#A11034).

### Kinase Assays and IC<sub>50</sub> Calculations

All kinase assays were performed by Eurofins Pharma Discovery Services UK Limited (Dundee, United Kingdom). IC<sub>50</sub> data for ULK1 and ULK2 was generated using 10-point IC<sub>50</sub>Profiler assays with half-log dilutions from top concentrations of 10  $\mu$ M (4 replicates) and 1  $\mu$ M (4 replicates), giving 8 data points for most concentrations in the curve. For selectivity profiling, KinaseProfiler assays with wild-type human kinase panels were performed in duplicate using 500 nM SBI-0206965, 40 nM ULK-101, or 15 nM ULK-100. For each kinase reaction, the Km concentration of ATP was used. The percent activity remaining and percent inhibition were calculated from negative control wells. For selectivity profiling, relative inhibition was calculated by dividing the percent inhibition of each kinase by the percent inhibition of ULK1. GraphPad Prism 7 was used for IC<sub>50</sub> determinations by fitting curves with variable slope (four-parameter) non-linear regression models using top and bottom constraints of 100% and 0%, respectively.

### Cell Culture

293FT cells (Invitrogen, #R7007) were maintained in DMEM (Gibco, #11965) supplemented with 10% fetal bovine serum (FBS; CellGro, #35-010-CV). U2OS cells (ATCC, #HTB-96) were maintained in McCoy's 5A (Gibco, #16600) supplemented with 10% FBS. NSCLC lines were obtained from ATCC (H727, #CRL-5815; H2030, CRL-5914; A549, #CCL-185) or Horizon Discovery (H838, #HDPAR-087). All NSCLC lines were maintained in RPMI-1640 (Gibco, #11875) supplemented with 10% FBS. Cells were cultured at 37°C with 5% CO<sub>2</sub> and humidity. Starvation media included 1xDPBS (Gibco, #14080, diluted 1:10 in distilled water) supplemented with 1g/L D-glucose and 10% FBS (for Figs. 1C-D) and HBSS (Gibco, #14025) supplemented with 2g/L D-glucose (for Figure 4F). Optistarve media (for Figure 5) was made by supplementing HBSS with 0.1% FBS, 1 mM L-Glutamine (Gibco, #25030), 2 g/L D-glucose, 12.5% RPMI 1640 Amino Acid Solution (Sigma-Aldrich, #R7131), and 25% RPMI 1640 Vitamin Solution (Sigma-Aldrich, #R7256).

### **BECLIN-pSer15 Expression Constructs and Transfection**

V5-BECLIN 1 was generated by cloning the coding region of BECLIN 1 (BC010276.1) into pRK7 and introducing an N-terminal V5 tag by PCR. pEGFP-ATG14 was a gift from Tamotsu Yoshimori (Addgene #21635). HA-hULK1 (Addgene #31963), Myc-mULK1-WT (Addgene #31960), and Myc-mULK1-M92A (#31962) were gifts from Do-Hyung Kim. For transfection, 293FT cells were seeded on 6-well dishes ( $1.6 \times 10^5$  cells per well) for 48 hours prior to transfection with 0.3  $\mu\text{g}$  BECLIN 1, 0.6  $\mu\text{g}$  ULK1, and/or 0.6  $\mu\text{g}$  ATG14 using Oligofectamine (Invitrogen, #12252011). Transfection complexes remained on cells for 24 hours prior to assay endpoints.

### **Immunoblotting**

Cells were lysed in ice-cold lysis buffer [10 mM  $\text{KPO}_4$ , 1 mM EDTA, 10 mM  $\text{MgCl}_2$ , 5 mM EGTA, 50 mM bis-glycerophosphate, 0.5% NP40, 0.1% Brij35, 0.1% sodium deoxycholate, 1 mM  $\text{NaVO}_4$ , 5 mM NaF, 2 mM DTT, and complete protease inhibitors (Sigma-Aldrich, #P8340)] and proteins resolved by SDS-PAGE. Hand-poured 10% acrylamide gels were used for Figure 1 and pre-cast BOLT 4-12% Bis-Tris Plus (Invitrogen, #NW04125BOX) gels were used for all other blots. Proteins were transferred to nitrocellulose membranes (or PVDF membranes for LC3 blots) and probed with primary antibodies overnight at 4°C followed by secondary antibodies for 1 hour at room temperature. Proteins were detected by enhanced chemiluminescence (Figure 1C), or imaged and quantified on an Odyssey Classic or Odyssey Clx imager (for all other blots).

### **Fluorescent Microscopy**

pMXs-puro-GFP-DFCP1 was a gift from Noboru Mizushima (Addgene #38269). A monoclonal U2OS-EGFP-DFCP1 cell line was generated by transducing cells with retrovirus expressing this plasmid and selecting a low-expressing monoclonal. Cells were seeded at 20,000 per chamber of a 4-chamber 35 mm no. 1.5 glass-bottom dish (Greiner Bio-One, #627870) for 24 hours. Media was replenished and cells treated with 5  $\mu\text{M}$  ULK-101 (or DMSO control) and 100 nM AZD8055 (or DMSO control). Images were captured in the FITC channel every 30 minutes using a Nikon Ti Eclipse microscope enclosed with a cage incubator and maintained at 37°C with humidified 5%  $\text{CO}_2$ . For quantification, images were deconvolved, smoothed, top-hat transformed (“detect peaks” function), and thresholded (by intensity) using NIS Elements to obtain the number of DFCP1-positive objects per cell. For Figure 4C, U2OS cells stably expressing ptfLC3B (gift from Tamotsu Yoshimori; Addgene #21074) were seeded for approximately 48 hours on no. 1.5 coverglass discs in a 24-well dish. Cells were treated with 5  $\mu\text{M}$  ULK-101 (or DMSO control) for 3 hours. 1.5 hours later, media was supplemented with 100 nM BafA1 (or a volume-equivalent of DMSO). Cells were then fixed with 4% formaldehyde and nuclei stained with Hoechst-33342. Cells were imaged in the FITC (green) and DAPI (blue) channels. For quantification, images were deconvolved, top-hat transformed (“detect peaks” function), and thresholded (by intensity) using NIS Elements to obtain the number of GFP-LC3-positive objects per cell.

### **ATG12 Immunofluorescence**

U2OS cells were treated with 100 nM AZD8055 or a volume-equivalent of DMSO with or without 5  $\mu$ M ULK-101 (or DMSO control) for 2.5 hours. Cells were fixed with 4% formaldehyde, permeabilized with 0.2% triton-X100 in 1xDPBS, blocked with 3% bovine serum albumin (BSA) and 5% goat serum in 1xDPBS, and stained with anti-ATG12 antibodies (diluted 1:100 in blocking buffer) overnight at 4°C. Cells were then stained with AF488-conjugated secondary antibodies (at 1:1000) for 1 hour at room temperature, nuclei counterstained with Hoechst-33342, and coverglass inverted onto microslides with gel mount. Cells were imaged with a 60x oil objective in the FITC (green) and DAPI (blue) channels on a Nikon Ti Eclipse microscope. 30-50 cells per condition were imaged and representative images shown in Figure 3C.

### **Clonogenic Survival Assays**

Cells (U2OS or NSCLC) were seeded on tissue culture treated 96-well plates at 1,000 cells per well in RPMI-1640 media supplemented with 10% FBS. Twenty four hours later, media was aspirated, wells rinsed with 1x DPBS, and replaced with full media (FM) or Optistarve (OS) with a concentration gradient of ULK-101 (final concentrations of 100  $\mu$ M, 50  $\mu$ M, 25  $\mu$ M, 12.5  $\mu$ M, 6.25  $\mu$ M, 3.1  $\mu$ M, 1.6  $\mu$ M, 0.8  $\mu$ M, 0.4  $\mu$ M, or 0  $\mu$ M). Two days later, media (and ULK-101) was aspirated, wells were rinsed with 1x DPBS, and all wells replaced with FM. Five days later, relative ATP levels were measured using a luminescent CellTiter-Glo (Promega) assay following manufacturer's instructions.

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