# Acetylation site specificities of lysine deacetylase inhibitors in human cells

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Lysine deacetylases inhibitors (KDACIs) are used in basic research, and many are being investigated in clinical trials for treatment of cancer and other diseases. However, their specificities in cells are incompletely characterized. Here we used quantitative mass spectrometry (MS) to obtain acetylation signatures for 19 different KDACIs, covering all 18 human lysine deacetylases. Most KDACIs increased acetylation of a small, specific subset of the acetylome, including sites on histones and other chromatinassociated proteins. Inhibitor treatment combined with genetic deletion showed that the effects of the pan-sirtuin inhibitor nicotinamide are primarily mediated by SIRT1 inhibition. Furthermore, we confirmed that the effects of tubacin and bufexamac on cytoplasmic proteins result from inhibition of HDAC6. Bufexamac also triggered an HDAC6-independent, hypoxia-like response by stabilizing HIF1- $\alpha$ , providing a possible mechanistic explanation of its adverse, pro-inflammatory effects. Our results offer a systems view of KDACI specificities, providing a framework for studying function of acetylation and deacetylases.

Lysine acetylation is a reversible post-translational modification that is controlled by the opposing activities of lysine acetyltransferases and deacetylases. The human genome encodes 18 different lysine deacetylases (KDACs), which play important regulatory roles in several biological processes, including gene transcription<sup>1</sup>, gene silencing<sup>2</sup>, cytoskeletal reorganization and cell migration<sup>3</sup>, and DNA damage repair<sup>4</sup>. Based on their sequence homology with yeast deacetylases as well as their domain organization and subcellular localization, KDACs are classified into four different classes (**Fig. 1a**). The importance of KDACs in mammalian physiology is highlighted by the essential roles of many deacetylases in embryonic viability or postnatal development in mouse models<sup>5–7</sup>.

Dysregulation of acetylation has been implicated in various human diseases, and thus KDACs are attractive therapeutic targets<sup>8,9</sup> for diseases such as viral infections<sup>10</sup>, inflammation<sup>11</sup>, neurodegenerative diseases<sup>12</sup>, metabolic disorders<sup>13</sup> and cancer<sup>9</sup>. In the past decade, >400 clinical trials have been initiated with different KDACIs, leading to the approval of vorinostat (Zolinza; suberoylanilide hydroxamic acid, SAHA) and romidepsin (FK228) for the treatment of cutaneous T-cell lymphoma<sup>14</sup>. The therapeutic potential of KDACIs has encouraged the development of KDACIs with selectivity for different deacetylases, and currently more than a dozen different inhibitors are being tested in clinical trials<sup>14–17</sup>.

The specificities of KDACIs have been extensively determined at the level of the enzyme that they target, often using *in vitro* deacetylation

assays with recombinant deacetylases<sup>18</sup> or chemical proteomics-based approaches<sup>19,20</sup>. However, these methods do not reveal KDACI specificity in cells at the level of individual acetylation sites, which is critical for understanding their distinct modes of action and for stimulating scientific investigation and elucidating new therapeutic opportunities.

Here we applied quantitative MS to evaluate the specificities of 19 structurally divergent KDACIs at the level of acetylation sites affected in human cells. We quantified acetylation at more than 8,000 sites in inhibitor-treated HeLa cells and used genetic KDAC knockout cells to confirm the predicted specificities of several prominent KDACIs.

## RESULTS

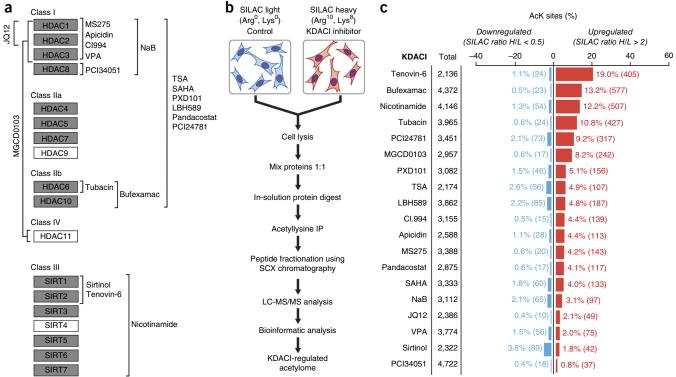
## Strategy for KDACI-regulated acetylome analysis

We selected 19 KDACIs that are widely used as research tools or drugs, and cover the entire selectivity range for human deacetylases, albeit with varying specificity profiles, as determined in previous studies using *in vitro* deacetylation assays<sup>18–20</sup> (**Fig. 1a**). In addition, we included a highly selective HDAC1 and HDAC2 inhibitor, JQ12, which is a chemical tool for studying isoform-selective inhibition of class I KDACs (**Supplementary Note 1** and **Supplementary Fig. 1a–c**).

To evaluate the selectivity of KDACIs for acetylation sites in cells, we used a 'stable isotope labeling by amino acids in cell culture' (SILAC)-based quantitative MS approach<sup>21</sup>. Human cervical cancer (HeLa) cells were metabolically labeled with different stable isotopic

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**Figure 1** Quantitative profiling of the KDACI-regulated acetylome. (a) An overview of the 19 KDACIs used for cell-based acetylome analysis and their reported specificities for human deacetylases based on cell-free assays. KDACs shown in dark gray background have been shown to be expressed in HeLa cells<sup>50</sup>. (b) The experimental design. SILAC-labeled HeLa cells were treated for 16 h with KDACIs or vehicle control. Subsequently, proteins were extracted and proteolyzed using Lys-C and trypsin. Acetylated peptides were enriched with anti-acetyllysine antibodies and fractionated by strong-cation exchange (SCX) chromatography. Peptides were analyzed by MS and data were used for downstream bioinformatic analyses. (c) The number of acetylation sites quantified and the fraction of acetylation sites regulated by individual KDACIs. The left part of the figure shows total number of quantified acetylation sites for each inhibitor. The bar chart shows the fraction of upregulated sites (>2-fold increase, shown in red) and the fraction of downregulated sites (>2-fold decrease, shown in blue). The numbers next to the bars indicate percent of up- or downregulated sites, and the number of up- or downregulated sites for each KDACI is indicated within parentheses. IP, immunoprecipitation. AcK, lysine acetylation.

forms of lysine and arginine (Lys<sup>0</sup> and Arg<sup>0</sup>, 'light' SILAC; or Lys<sup>8</sup> and Arg<sup>10</sup>, 'heavy' SILAC). The 'heavy'-labeled cells were treated for 16 h with the respective KDACIs, and their effects on acetylation levels were determined by comparison with 'light'-labeled control cells that were mock-treated with solvent (DMSO or H<sub>2</sub>O; inhibitor concentrations are provided in **Supplementary Table 1**). Acetylated peptides were enriched using anti-acetyllysine antibodies and analyzed by high-resolution  $MS^{22}$  (**Fig. 1b**).

### An overview of the KDACI acetylation screen

For each of the KDACIs, site-specific acetylation changes were quantified in two independent biological replicates, which had an average Pearson correlation coefficient of 0.71 (**Supplementary Fig. 2**), supporting the overall quantitative reliability of the approach. Altogether, the data set contains >8,100 quantified acetylation sites in HeLa cells (**Supplementary Table 2**), covering ~80% of previously identified sites<sup>23</sup> (**Supplementary Fig. 3**), which were localized to the indicated lysines with greater than 90% confidence (average site localization probability of 0.99). A majority (~85%) of the acetylation sites was quantified in more than one KDACI-treated sample, and nearly 60% of the sites were quantified in response to five or more KDACIs (**Supplementary Table 2**).

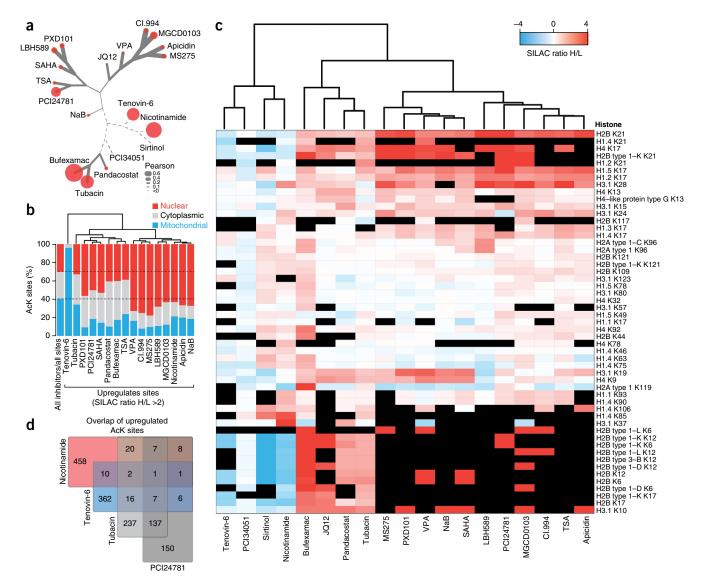
We quantified an average of >3,200 acetylation sites for each of the analyzed KDACIs (**Fig. 1c**), enabling us to assess in cells the inhibitory scope and acetylation pattern for each of the tested compounds.

For further analyses, we set a threshold of a greater than twofold increase or decrease in acetylation for regulated acetylation sites. Notably, most inhibitors increased acetylation of only a small fraction of the quantified sites (on average, 6.2%) above this threshold (**Fig. 1c**), demonstrating that a majority of KDACIs have a limited, though specific, inhibitory scope at the acetylation site level. The activity of KDACs diminishes protein acetylation levels; as expected, for all investigated inhibitors except sirtinol, the fraction of upregulated acetylation sites in KDACI-treated cells was greater than the fraction of downregulated sites (**Fig. 1c**).

#### Specificity of KDACIs for acetylation sites

To understand the specificity patterns of KDACIs in cells, we used average linkage clustering to group KDACIs based on their effects on the hyperacetylation of sites in cells. Many of the classical histone deacetylase inhibitors, such as LBH589, PXD101, SAHA and TSA, grouped together, and this group was closely related to the group of KDACIs targeting class I deacetylases including apicidin, MS275, CI.994, MGCD0103 and valproic acid (VPA) (**Fig. 2a**). The acetylation specificity profiles of many of these inhibitors in cells (i.e., apicidin, MS275, CI.994, MGCD0103) are consistent with their described deacetylase inhibitory profiles in cell-free systems. However, the inhibitory profiles of several KDACIs, such as tenovin-6, sirtinol and nicotinamide, were distinct from each other and from the remaining KDACIs.

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**Figure 2** Specificity of KDACIs and subcellular distribution of KDACI-upregulated acetylated proteins. (a) Site-based specificity analysis of KDACIs in HeLa cells. SILAC ratios of KDACI-upregulated sites were used to calculate pair-wise Pearson correlation coefficients for all KDACIs, and the inhibitors were grouped based on their correlation values using average linkage clustering approach (see **Supplementary Fig. 14** for pair-wise correlations). Node-size reflects number of upregulated sites, and line thickness corresponds to the degree of correlation. (b) Subcellular distribution of proteins with KDACI-upregulated acetylation sites. The bar plot shows the fraction of KDACI-upregulated acetylated proteins annotated with the indicated GO cellular compartment (GOCC) terms. As a reference, the first bar indicates subcellular distribution of all acetylation sites identified in this study. The dendrogram at the top of the plot shows similarity of KDACIs for upregulated subcellular acetylomes. Sirtinol, JQ12 and PCI34051 were excluded from this analysis owing to insufficient number of upregulated sites. (c) Profile of KDACI-regulated histone acetylation sites. The heatmap shows quantified histone acetylation sites and their regulation by KDACIs. The dendrogram illustrates similarity of KDACIs for histone acetylation sites. Black matrix areas show sites not identified for an individual inhibitor. (d) Overlap of acetylation sites upregulated in cells treated with broad-range KDACIs nicotinamide, tenovin-6, tubacin and PCI24781. The diagram displays the number of upregulated sites in response to each KDACI, as well as the number of sites found in two, three or all four of these inhibitors. AcK, lysine acetylation.

We examined the subcellular distribution of proteins with KDACIupregulated acetylation sites by association of acetylated proteins with the Gene Ontology (GO) terms "Nuclear," "Cytoplasm" and "Mitochondrial" (**Fig. 2b**). A majority of inhibitors caused increased acetylation of nuclear proteins. Notably, for eight of the inhibitors, more than 60% of upregulated acetylation sites were present on nuclear proteins (compared to 30% of all sites). Acetylation of N-terminal lysines in histones has numerous regulatory roles<sup>24,25</sup>. Several inhibitors of class I and IIa KDACs had similar regulatory profiles for histones and strongly increased acetylation of N-terminal lysines, whereas other KDACIs, such as PCI34051, sirtinol and tenovin-6, did not increase acetylation of the N-terminal histone tails (**Fig. 2c**). A large number of acetylation sites were also quantified on the middle and C-terminal parts of histones; however, most of these sites were not similarly upregulated by the KDACIs, indicating that histone deacetylases function in a site-selective manner and differentially affect distinct sites on the same proteins.

Tenovin-6, nicotinamide and tubacin were among the most promiscuous inhibitors, each increasing acetylation at more than 10% of all quantified sites (**Fig. 1c**). However, the acetylation profiles of these inhibitors were relatively distant from each other, and from that of most other inhibitors (**Fig. 2a**). Many acetylation sites were

Figure 3 Nicotinamide increases acetylation of nuclear proteins. (a) Functional annotation of proteins containing nicotinamide-upregulated acetylation sites in HeLa cells. Significantly enriched GO biological process (GOBP) terms associated with nuclear processes are indicated. Gray bars: all sites identified; black bars: upregulated sites. (b) The scatter plot shows the correlation between nicotinamideregulated acetylation in MV4-11 and HeLa cells. Correlation was determined with Pearson correlation coefficient. (c) The scatter plots show the correlation between acetylation sites quantified in biological replicate experiments for nicotinamide-treated WT MEFs, Sirt1-/- MEFs, as well as between these two conditions. Correlation was determined with Pearson correlation coefficient. (d) Functional annotation of proteins with nicotinamide- or SIRT1-upregulated acetylation sites in MEF cells. Significantly enriched GO terms are indicated. Heatmap represents P-values for each term in comparison to whole mouse proteome. The numbers within boxes indicate hyperacetylated proteins covering the percent of proteins associated with the indicated GO terms.

commonly quantified in cells treated with broad-range inhibitors such as tenovin-6, nicotinamide, PCI24781 and tubacin; however, few sites were commonly regulated by these inhibitors (**Fig. 2d**). Thus, each of

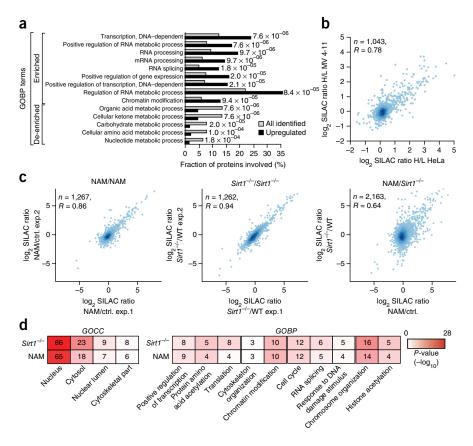
these inhibitors affects a large, but distinct, subset of acetylation sites. Among these four KDACIs, only tubacin- and PCI24781-upregulated sites showed a substantial overlap, consistent with both compounds targeting HDAC6 (refs. 26,27).

Based on the fraction of upregulated sites, the HDAC8-specific inhibitor PCI34051 (ref. 28) was the most selective KDACI in our screen (**Fig. 1c**). We identified SMC3 acetylation as a key target of this inhibitor (**Supplementary Table 2** and **Supplementary Fig. 4a,b**). Acetylation of lysines K105 and K106 of SMC3 is important for the establishment of chromosome cohesion<sup>29–31</sup>. These results confirm a recent study that identified HDAC8 as an SMC3 deacetylase<sup>32</sup> and indicate that HDAC8, at least in cultured human cells, functions as a highly selective deacetylase targeting only a few proteins.

Considering the broad effects of tubacin, bufexamac, tenovin-6 and nicotinamide, and their distinct acetylation profiles, we decided to further analyze the mechanisms and properties of the acetylation sites and proteins that were affected by these inhibitors.

#### Nicotinamide increases acetylation of nuclear sites

Sirtuin deacetylases require the cofactor NAD<sup>+</sup> for deacetylase activity and generate nicotinamide from NAD<sup>+</sup> during the deacetylation reaction. Nicotinamide, which noncompetitively inhibits sirtuins without affecting their binding of NAD<sup>+</sup> (ref. 33), has been widely used as a pan-sirtuin inhibitor. In our data set, nicotinamide was among the inhibitors that affected the largest number of sites; it increased acetylation more than twofold at 12% of sites and more than 1.5-fold at 20% of sites (**Fig. 1c** and **Supplementary Table 2**), suggesting a broad substrate range for sirtuin deacetylases. Nicotinamide-sensitive acetylation sites were predominantly present on nuclear proteins that are involved in diverse biological processes in this compartment (**Figs. 2b** and **3a**). Acetylation of most mitochondrial proteins was



not specifically increased even after long-term (72 h) treatment with nicotinamide (**Supplementary Fig. 5a–c** and **Supplementary Table 3**), despite sirtuins being the only known deacetylases in this organelle (**Fig. 2b** and **Supplementary Table 4**). These unexpected results were independently confirmed in human acute myelocytic leukemia cells (MV4-11; **Fig. 3b** and **Supplementary Table 5**).

Among the nicotinamide-upregulated acetylation sites, many were present on known substrates of sirtuin 1 (SIRT1) such as p53, BAZ2a, NPM1, MOF, WRN, Ku70 and Ku80 (**Supplementary Tables 4** and **5**). In addition, many proteins with nicotinamide-upregulated acetylation sites were interconnected in functional networks and were enriched in GO terms such as transcription, splicing and DNA damage (**Supplementary Fig. 6a**).

To identify the cellular deacetylases that are targets of nicotinamide, we compared nicotinamide-regulated acetylation in mouse embryonic fibroblasts (MEFs) to acetylation changes caused by deletion of Sirt1, Sirt2 or Sirt6 (Supplementary Fig. 6b-c and Supplementary Tables 6–9), whose products are known to deacetylate proteins in nonmitochondrial compartments. Similar to nicotinamide treatment, and in agreement with a previous study<sup>34</sup>, deletion of Sirt1 led to an acetylation increase at several hundred sites in Sirt1-/-cells (Supplementary Table 6). The SIRT1- and nicotinamide-regulated acetylomes were strongly correlated (R = 0.63) (Fig. 3c), and similar GO terms were enriched in the nicotinamide- and SIRT1-regulated acetylomes (Fig. 3d), suggesting that SIRT1 is the major target of nicotinamide in cells. This is also supported by a good correlation of nicotinamide- and the SIRT1 inhibitor EX-527-regulated acetylomes (R = 0.68; Supplementary Fig. 7 and Supplementary Table 10). In contrast, a smaller fraction of the acetylome changed in  $Sirt2^{-/-}$  and Sirt6<sup>-/-</sup> cells compared to Sirt1<sup>-/-</sup> cells, and these changes correlated weakly with nicotinamide-induced changes (R = 0.1) (Supplementary

Figure 4 Tubacin- and bufexamac-mediated increase in protein acetylation is likely mediated by HDAC6. (a) The scatter plot shows the correlation between acetylation sites quantified in tubacin- and bufexamac-treated HeLa cells. Correlation was determined with Pearson correlation coefficient. (b) Verification of Hdac6 deletion in knockout MEFs. Expression of HDAC6 and acetylation of tubulin were analyzed by immunoblotting. (c) The scatter plots show the correlation between acetylation sites identified in biological replicate experiments of tubacinor bufexamac-treated MEF cells and Hdac6-/- cells, as well as between each condition. Correlation was determined by Pearson correlation coefficient. (d) Functional annotation of proteins with upregulated acetylation sites in bufexamac- or tubacin-treated MEFs or in Hdac6-/-MEFs. Significantly enriched GO terms are indicated. Heatmap represents *P*-values for each GO term in comparison to whole mouse proteome. The numbers within boxes indicate percent of hyperacetylated proteins associated with the indicated GO terms. n.d., not determined.

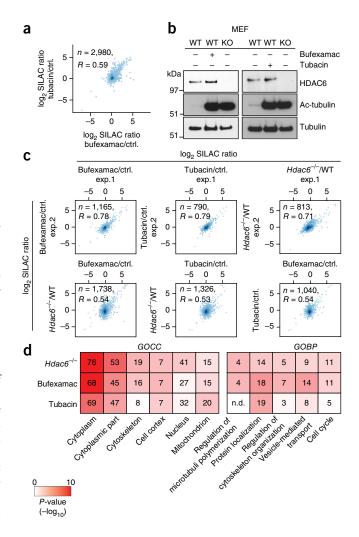
**Figs. 6d** and **8**). SIRT2-regulated acetylation also showed a modest correlation with the SIRT2 inhibitors sirtinol and AGK2 (R = 0.11 for sirtinol vs. *Sirt2<sup>-/-</sup>*; R = 0.35 for AGK2 vs. *Sirt2<sup>-/-</sup>*) (**Supplementary Fig. 8** and **Supplementary Tables 8** and **9**), indicating that these inhibitors weakly inhibited SIRT2 in MEFs at the concentrations used in our study.

#### Tenovin-6 increases mitochondrial acetylation

We and others have previously identified a large number of acetylation sites on mitochondrial proteins in human cells<sup>22,35,36</sup>; however, no KDACI has been demonstrated to selectively increase acetylation of mitochondrial proteins. In our screen, we identified tenovin-6 as a specific regulator of mitochondrial acetylation (Fig. 2b and Supplementary Fig. 9a). In total, 405 acetylation sites showed elevated acetylation upon tenovin-6 treatment (Supplementary Table 2), and a large majority of these sites (more than 90%) was present on proteins annotated as mitochondrial (Supplementary Fig. 9b), corresponding to more than 50% of all identified mitochondrial acetylation sites in tenovin-6 treated cells. Several mitochondria-related GO terms, such as mitochondrial matrix and mitochondrial membrane, showed significant enrichment among proteins with tenovin-6-upregulated acetylation sites (Supplementary Fig. 9b). Also, enzymes that participate in metabolic pathways, such as the tricarboxylic acid cycle and fatty acid betaoxidation, were significantly enriched within the group of differentially acetylated proteins (Supplementary Fig. 9c,d). These data demonstrate that tenovin-6, an anti-cancer compound, specifically increases acetylation of mitochondrial proteins.

#### Tubacin and bufexamac inhibit HDAC6

Tubacin and bufexamac were among the few inhibitors that affected a broad substrate range with similar acetylation changes (**Fig. 4a**) and increased acetylation of the well-known HDAC6 substrate cortactin<sup>37</sup> (**Supplementary Tables 2** and **11**). Tubacin and bufexamac have been reported to be selective for HDAC6 (refs. 19,27), and the broad effects on the cellular acetylome we observed prompted us to investigate whether these changes are mediated by HDAC6 or through independent mechanisms. We found that deletion of *Hdac6* also affected a large number of acetylation sites in MEF cells, and HDAC6-regulated acetylation changes correlated with those caused by tubacin and bufexamac treatment (R = 0.54 for bufexamac vs. *Hdac6<sup>-/-</sup>*; R = 0.53 for tubacin vs. *Hdac6<sup>-/-</sup>*) (**Fig. 4b,c** and **Supplementary Table 12**). Furthermore, similar GO terms were enriched among proteins with increased acetylation in response to inhibitor treatment or deletion of *Hdac6* (**Fig. 4d**). These data showed that a large fraction of



bufexamac- and tubacin-regulated acetylation is likely to be caused by inhibition of their target deacetylase HDAC6.

#### Bufexamac activates the HIF1- $\alpha$ pathway

Until recently, bufexamac was used as a nonsteroidal anti-inflammatory drug (NSAID) for the treatment of inflammatory dermatoses, but due to growing evidence that it can provoke contact dermatitis, its clinical use was revoked in Europe in 2010 (ref. 38). The mechanisms by which bufexamac causes inflammation remain unknown.

A majority of bufexamac-based ointments thought to be antiinflammatory contained very high concentrations of this compound (~5%, corresponding to 224 mM), whereas it is known that bufexamac efficiently increases acetylation of the HDAC6 target tubulin at 10,000-fold lower concentrations (<10  $\mu$ M)<sup>19</sup> (Fig. 5g). To understand the possible mechanistic basis of its pro-inflammatory effects, we analyzed changes in lysine acetylation and protein expression in HeLa cells treated with two different concentrations of bufexamac (50 µM (0.001%) and 1 mM (0.022%); Supplementary Fig. 10a). The high dose concentration used here is similar to the lowest doses of bufexamac that are sufficient to cause inflammatory reactions in patients<sup>39</sup>. High-dose bufexamac substantially increased abundance of an acetylated peptide from hypoxia-inducible factor 1 alpha (HIF1- $\alpha$ ) (Supplementary Fig. 10b and Supplementary Table 2). HIF1-α is a transcription factor that plays essential roles in the cellular responses to hypoxia, and acetylation can stabilize HIF1-α protein by preventing

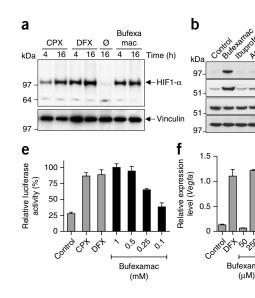
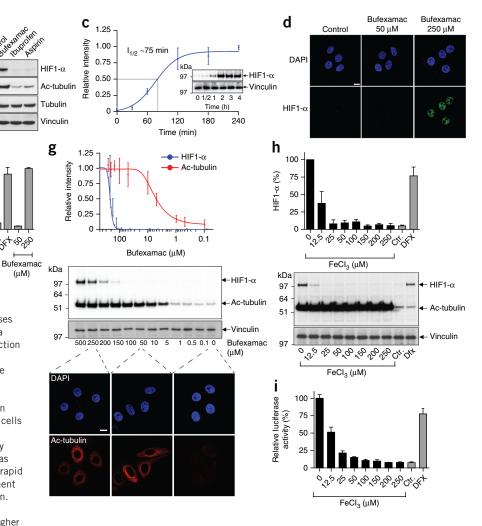


Figure 5 Bufexamac inhibits KDACs at lower concentrations and causes hypoxia-like responses at higher concentrations. (a) Treatment of HeLa cells with 1 mM bufexamac results in the induction of HIF1- $\alpha$ , as determined by immunoblotting. The known hypoxia mimetics CPX and DFX were used as positive controls; vinculin served as loading control. (b) Verification of bufexamacspecific upregulation of HIF1-α. HIF1-α protein expression was analyzed 4 h after treatment of cells with the indicated compounds. Ac, acetylated. (c) Time-course analysis of HIF1- $\alpha$  induction by bufexamac. The induction of HIF1- $\alpha$  protein was analyzed by immunoblotting. The graph shows rapid stabilization of HIF1- $\alpha$  upon bufexamac treatment with half-maximal intensity  $I_{1/2}$  of about 75 min. Error bars represent s.d. of three independent experiments. (d) HIF1- $\alpha$  is stabilized only at higher



concentrations of bufexamac and accumulates in the nucleus. Induction of endogenous HIF1- $\alpha$  and its nuclear accumulation was analyzed using immunofluorescence microscopy; scale bar, 10 µm. (e) Bufexamac increases transcriptional activity of HIF1- $\alpha$ . Luciferase activity was measured in HeLa cells transfected with HRE-luciferase reporter upon treatment with CPX, DFX or bufexamac. Error bars represent s.d. of three independent experiments. (f) Bufexamac treatment increases expression of HIF1- $\alpha$  target vascular endothelial growth factor A. *Vegfa* mRNA levels were assessed by real-time PCR and the data were normalized to *Gapdh*. Error bars represent s.d. of two independent experiments. (g) Dose-response curves of bufexamac-treated cells and the corresponding immunoblots are shown (HIF-1 $\alpha$  and acetyl-tubulin were visualized simultaneously by using a mixture of anti-HIF-1 $\alpha$  and K40-acetyl-tubulin antibodies). Error bars represent s.d. from three independent experiments. Lower panel shows immunofluorescence images of HeLa cells treated with 50 µM and 250 µM bufexamac and immunostained for acetylated tubulin. Scale bar, 10 µm. (h) Dose-response plot showing HIF1- $\alpha$  rote in levels and a representative corresponding immunoblot. Cells were treated with 250 µM bufexamac and with the indicated concentrations of FeCI<sub>3</sub>. Data were normalized to the maximal HIF1- $\alpha$  transcriptional activity. Cells were transfected with a HRE-luciferase reporter plasmid, and luciferase activity was measured after treatment with 250 µM bufexamac and different concentrations of FeCI<sub>3</sub>, as indicated. Error bars represent s.d. of three independent experiments. CPX, ciclopirox olamine; DFX, deferoxamine; HRE, hypoxia response element; *Gapdh*, glycerol aldehyde 3-phosphate dehydrogenase.

its proteasomal degradation<sup>40</sup>. Indeed, HIF1- $\alpha$  was strongly induced by bufexamac, and the increase in HIF1- $\alpha$  levels was comparable to commonly used hypoxia mimetics such as ciclopirox olamine (CPX) and deferoxamine (DFX) (**Fig. 5a**). In contrast to bufexamac, two other well-known NSAIDs, aspirin and ibuprofen, failed to increase HIF1- $\alpha$  protein levels, indicating that this effect is specific to bufexamac (**Fig. 5b**). HIF1- $\alpha$  was rapidly stabilized (**Fig. 5c**) and accumulated in the nucleus of bufexamac-treated cells (**Fig. 5d**).

Bufexamac readily increased the transcriptional activity of HIF1- $\alpha$  in a luciferase reporter assay (**Fig. 5e**), as well as increased the expression of its endogenous target gene vascular endothelial growth factor A (*VegfA*) (**Fig. 5f**). Furthermore, we analyzed changes in protein expression in bufexamac-treated cells by quantifying over 5,800

proteins (**Supplementary Table 13**). Among 23 proteins that were reproducibly upregulated by high-dose bufexamac in all three experiments, over 70% were previously known to be upregulated by hypoxia (**Supplementary Fig. 10c** and **Supplementary Table 13**). In contrast, none of those proteins was consistently upregulated in the low-dose bufexamac-treated cells. These results confirmed the induction of hypoxia-like responses in bufexamac-treated cells.

Notably, stabilization of HIF1- $\alpha$  occurred only at relatively high doses (>200  $\mu$ M) of bufexamac, whereas increased acetylation of tubulin was already detectable at substantially lower doses (>5  $\mu$ M; **Fig. 5g**). These results suggested that bufexamac-induced hypoxia responses may occur independently of its KDAC inhibitory functions. Bufexamac is a hydroxamic acid compound, and many compounds

of this class function as metal chelators. Because iron chelators are commonly used as hypoxia mimetics, we surmised that bufexamac may induce hypoxia-like responses by chelating cellular iron. Indeed, supplementation of iron during bufexamac treatment abolished bufexamac-induced HIF1- $\alpha$  protein induction in a dose-dependent manner (**Fig. 5h**) as well as its transcriptional activity (**Fig. 5i**). Treatment of iron-dependent HL-60 (human promyelocytic leukemia cells) cells with bufexamac caused cell death, and this effect was completely prevented by iron substitution (**Supplementary Fig. 11**). A direct interaction between bufexamac and iron was further shown by colorimetric iron chelation assay using UV/VIS spectroscopy (**Supplementary Fig. 12a,b**). Taken together, these results show that at lower doses bufexamac specifically inhibits HDAC6, whereas at higher concentrations it also chelates cellular iron, thereby activating the HIF1- $\alpha$ pathway by mimicking hypoxia (**Supplementary Fig. 13**).

## DISCUSSION

A large number of small-molecule KDACIs have been identified that show distinct selectivity for different deacetylases<sup>8,9,16</sup>. In addition to their clinical use, KDACIs are commonly used in basic research to study function of acetylation and deacetylation. Specificity profiles generated in cell-free systems are frequently used as a reference for selecting appropriate KDACIs. Knowing KDACI targets is important for interpreting the effects of inhibitors both in research and clinical settings. We provide a detailed comparison of KDACI specificities at the level of affected sites, shedding insights into their specificities for acetylation sites in cells (Supplementary Fig. 14 and Supplementary Note 2). For several KDACIs, the number of acetylation sites affected is not proportional to the number of KDACs they were found to inhibit in cell-free assays, which is consistent with recent studies demonstrating unexpected selectivities of KDACIs in vitro<sup>18,19</sup>. Our results complement data from cell-free systems and emphasize the importance of evaluating KDACI effects at the acetylation site level to better understand and refine the specificities of KDACIs.

Analysis of acetylation in several genetically defined cells showed that broad-range inhibitors nicotinamide, tubacin and bufexamac increased acetylation through inhibition of SIRT1 and HDAC6. Most other inhibitors of Zn<sup>2+</sup>-dependent deacetylases target multiple deacetylases (Fig. 1a) and commonly inhibit class I deacetylases. HDACs 1-3 are essential for cell viability, so we could not confirm their acetylation targets in knockout cells. However, several data indicate that these KDACIs regulate acetylation by specifically inhibiting class I KDACs: (i) acetylation was regulated in a site-specific manner, (ii) KDACIs increased acetylation of nuclear proteins, where their target deacetylases were present and (iii) they increased acetylation of sites present on the N-terminal tails of histones, many of which are known to be regulated by class I deacetylases. Contrary to their reported broad inhibitory effects on deacetylases in cell-free systems<sup>18,41</sup>, most of these KDACIs increased acetylation of small but specific, subsets of the acetylome. The scope of these inhibitors was more limited than that of tubacin and bufexamac, which inhibit only HDAC6 (and perhaps HDAC10), indicating that at concentrations applied here these inhibitors more potently inhibit class I deacetylases, but less potently inhibit HDAC6. The acetylation signatures of sirtuin inhibitors tenovin-6, nicotinamide and sirtinol were not fully consistent with their predicted inhibitory profiles, indicating that disparities between cell-free and cell-based acetylation profiles are not uncommon.

Nicotinamide and sirtinol have been identified as inhibitors of yeast Sir2 (ref. 33) and are used as sirtuin class deacetylase inhibitors. In this study, nicotinamide-upregulated 12% of acetylation sites,

whereas sirtinol affected less than 2% of sites, indicating that the scope of these inhibitors is vastly different. In contrast to several canonical KDACIs that inhibit  $Zn^{2+}$ -dependent deacetylases, nicotinamide increased acetylation of many nonhistone proteins in the nucleus without causing a widespread increase in histone acetylation levels. However, nicotinamide increased acetylation on several histone-modifying enzymes such as acetyltransferases and methyl-transferases, and other chromatin-associated proteins. The low overlap (~10%) between sites upregulated by nicotinamide and each of the nonsirtuin-targeting KDACIs suggests a minimal redundancy between sirtuins and  $Zn^{2+}$ -dependent histone deacetylases. We found that most of the nicotinamide-induced acetylation changes were mediated through inhibition of SIRT1, highlighting the broad target range of SIRT1 and suggesting that the physiological effects of nicotinamide may be primarily mediated by inhibiting SIRT1 function.

Mitochondria exclusively contain NAD+-dependent deacetylases, and thus our results showing only a modest increase in mitochondrial acetylation by nicotinamide are unexpected. The possible reasons for this remain unclear, but it could be that mitochondrial sirtuins are less sensitive to nicotinamide, that nicotinamide is excluded from mitochondria or that nicotinamide is rapidly metabolized to NAD+ by nicotinamide phosphoribosyltransferase (NAMPT)<sup>42</sup>. Metabolic conversion of nicotinamide to NAD<sup>+</sup> may result in lower effective concentrations of nicotinamide, and subsequent import of NAD+ into mitochondria may counteract its effect by activating sirtuins in this compartment. Tenovin-6 inhibits SIRT1 and SIRT2 in cell-free systems, whereas it weakly inhibits SIRT3 (ref. 43); however, in cells, it increased acetylation of mitochondrial proteins, which suggests that it may increase acetylation by a yet unknown mechanism. With the emerging role of mitochondrial acetylation in regulating diverse metabolic pathways<sup>44,45</sup> and its relevance to the stress response<sup>46,47</sup>, the identification of tenovin-6 as a potent inducer of mitochondrial acetylation may further facilitate studying the functional relevance of acetylation in this context.

The mechanism of bufexamac-mediated inflammation, which led to its removal as a treatment for dermatoses, has never been definitively determined. We showed that at higher concentrations (>200  $\mu$ M), bufexamac chelates cellular iron, potently stabilizes HIF1- $\alpha$  and induces downstream hypoxia-like responses (**Supplementary Fig. 13**). The concentrations of bufexamac present in most anti-inflammatory drugs would be more than adequate to cause local hypoxia-like responses at the applied regions. Furthermore, the drug was applied at already inflamed regions, making it plausible that even much lower doses than those present in the prescribed ointments would have been sufficient to induce hypoxic responses. The connection between hypoxia and inflammation is well described<sup>48</sup>. Thus, our data provide new insights into the possible mechanistic basis of the bufexamacinflammation paradox and illustrate the usefulness of unbiased proteomic analyses in discovering cellular mechanisms of drugs.

Although the global acetylome analyses applied here provide a powerful approach for obtaining an unbiased (nonhypothesis-driven) picture of cellular targets of KDACIs, caution should be taken in interpreting the biological functions of KDACI-regulated acetylation sites. First, although we have applied a twofold change as a cut-off to classify KDACI-regulated sites, it is possible that less robust changes (i.e., 50% increases in acetylation) could have important biological consequences. Second, in this work we compared changes in acetylation using a single inhibitor dose and time point, though it is plausible that the effects of KDACIs are dose- and time-dependent, and that by varying doses and treatment times, one may identify additional substrates. Third, our analyses cannot distinguish between direct

and indirect targets of deacetylases inhibited by KDACIs. Thus, for functional investigations of specific acetylation sites it is important to independently verify their regulation by KDACIs using varying doses and time points. Nevertheless, our results offer a snapshot of the KDACI substrate spectrum at the most commonly used doses, providing a road map for further investigations.

In summary, our results give a global picture of acetylation sites regulated by KDACIs and their several downstream deacetylases and provide a detailed comparative view of their regulatory scope. These results exemplify the usefulness of quantitative MS screens in revealing endogenous acetylation profiles for known KDACIs in cells and in identifying selective KDACIs for sites of interest. In addition to elucidating broad outlines of acetylation inhibition, this resource data set will be useful in investigating the functional roles of deacetylases and their target sites, in understanding the molecular basis of drugs targeting deacetylases, in evaluating specificity of novel KDACIs and in developing new therapies.

## METHODS

Methods and any associated references are available in the online version of the paper.

Accession codes. The MS proteomics data have been deposited to the ProteomeXchange Consortium (http://proteomecentral. proteomexchange.org) via the PRIDE partner repository<sup>49</sup> with the data set identifier PXD001377.

Note: Any Supplementary Information and Source Data files are available in the online version of the paper.

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#### AUTHOR CONTRIBUTIONS

C.S. performed most of the experiments and collected data. B.T.W. performed initial experiments, and obtained data in MV4-11 cells, S.A.W. helped with bioinformatic analyses, P.B. assisted with immunofluorescence microscopy, Y.M. provided HDAC6 knockout cells, L.J.J. performed average linkage clustering analysis of KDACIs, W.S. performed UV/VIS spectroscopy, J.Q. synthesized JQ12 and performed *in vitro* KDAC enzymatic assays for this compound, A.R.M., N.J.W. and S.L. provided tenovin-6, J.C. helped with computational analysis of MS data, P.M. provided critical research reagents, M.M. was involved in the planning of the tenovin-6 experiments, provided pandacostat and JQ12, C.C. planned the project, C.C. and C.S. wrote the manuscript; all co-authors provided input for writing the paper.

#### COMPETING FINANCIAL INTERESTS

The authors declare no competing financial interests.

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#### **ONLINE METHODS**

**Materials.** KDACIs were purchased either from Sigma-Aldrich, Selleckchem or Chemie-Tek. All other standard chemicals were obtained from Sigma-Aldrich and Merck KGaA. Cell culture media and reagents were from Invitrogen. SILAC amino acids were purchased from Cambridge Isotope Laboratories. Agarose-conjugated anti-acetyllysine antibodies were purchased from Immunechem Inc. (catalog no.: ICP0388). Antibodies for immunoblotting were purchased from Abcam (H3Ac-K122, ab33309), Millipore (H4Ac-K16, 07-329), Cell Signaling (Ac-tubulin, 5335P; Ac-Lysine, 9441; SIRT1, 2028; c-myc, 2276), Sigma-Aldrich (vinculin, V9264; tubulin, T5326), Santa Cruz (SMC3, sc-376352; HDAC8, sc-374180) and Epitomics (HIF1- $\alpha$ , 2015-1). Anti-mHDAC6 antibody was generated by P. Matthias laboratory; purified recombinant protein antigen corresponding to the C-terminal ZnF-domain of mHDAC6 was injected into rabbits (Pocono rabbit farm & laboratory; USA) and serum containing mHDAC6 antibody was used for further antibody purification.

HDAC biochemical assay for JQ12. JQ12 was tested against HDAC1-9, and the activity was determined with an optimized homogenous assay performed in a 384-well plate. Compound was incubated with HDAC enzyme for 3 h. Reactions were performed in assay buffer (50 mM HEPES, 100 mM KCl, 0.001% Tween-20, 0.05% BSA and pH 7.4; additional 200 µM TCEP was added for HDAC6) and followed by fluorogenic release of 7-amino-4-methylcoumarin from substrate upon deacetylase and trypsin enzymatic activity. Fluorescence measurements were obtained every 5 min using a multilabel plate reader and plate-stacker (Envision; PerkinElmer). Each plate was analyzed by plate repeat, and the first derivative within the linear range was imported into analytical software (Spotfire DecisionSite). Replicate experimental data from incubations with inhibitor were normalized to DMSO controls ([DMSO] < 0.5%). IC<sub>50</sub> was determined by logistic regression with unconstrained maximum and minimum values (Supplementary Fig. 1b,c). The recombinant, full-length HDAC protein (BPS Biosciences) was incubated with fluorophore conjugates substrate, MAZ1600 and MAZ1675 at  $K_{\rm m}$  = [substrate].

Cell culture, SILAC labeling, preparation of cell lysates and protein digestion. Double SILAC experiments. HeLa (ATCC: CCL-2) and MV4-11 (ATCC: CRL-9591) cells were grown in DMEM and RPMI, respectively, supplemented with 10% FBS, 2 mM L-glutamine and 1% penicillin/streptomycin. For SILAC labeling, cells were cultured in the appropriate medium containing either L-arginine and v-lysine (light label) or L-arginine- ${}^{13}C_{6}$ - ${}^{15}N_{4}$  and L-lysine- ${}^{13}C_{6}$ - $^{15}\mathrm{N}_2$  (heavy label). All cells were cultured at 37 °C in a humidified incubator at 5% CO2. At a confluency of ~90%, heavy-labeled cells were treated for 16 h with the respective HDAC inhibitor (for concentrations used in this study, please refer to Supplementary Table 1), whereas light-labeled cells were mock-treated with DMSO and H2O, respectively. Each experiment was performed at least in biological duplicates. Cells were washed twice with PBS and lysed in modified RIPA buffer (50 mM Tris-HCl (pH 7.5), 150 mM NaCl, 1 mM EDTA, 1% NP-40 and 0.1% sodium deoxycholate, supplemented with Complete protease inhibitor mix (Roche). Lysates were mixed with 1/10 volume of 5 M NaCl to release chromatin-bound proteins and incubated for 15 min on ice. Subsequently, lysates were homogenized by sonication (6  $\times$  10 sec, 15 W), cleared by centrifugation (20,000g, 15 min, 4 °C) and proteins were precipitated overnight at -20 °C by the addition of four volumes of ice-cold acetone. Precipitates were redissolved in 8 M urea (6 M urea, 2 M thiourea) and protein concentration was determined by Quick-start Bradford assay (Bio-Rad). Corresponding SILAC-labeled proteins (heavy- and light-labeled) were mixed in a 1:1 ratio, reduced with 1 mM DTT (45 min, RT) and alkylated by 5.5 mM chloracetamide (45 min, RT). 20 mg proteins were digested by endoproteinase Lys-C (1:100 w/w; Wako) and, after fourfold dilution with HEPES buffer (50 mM; pH 7.5), by modified sequencing grade trypsin (1:100 w/w; Sigma-Aldrich). Digestion was stopped by the addition of trifluoroacetic acid (TFA) to a final concentration of 1%.

*Triple SILAC experiments.* MEF cells (wild type (WT), Hdac6<sup>-/-</sup> (ref. 51), Sirt1<sup>-/-</sup> (ref. 52), Sirt2<sup>-/-</sup> (ref. 53), Sirt6<sup>-/-</sup> (ref. 54)) were grown in DMEM, as described above. For SILAC labeling, WT cells were cultured in DMEM containing either L-arginine and L-lysine (light label), or in medium supplemented with L-arginine-<sup>13</sup>C<sub>6</sub> and L-lysine-<sup>2</sup>H<sub>4</sub> (medium label), whereas the

corresponding knockout (KO) cells were heavy-labeled using DMEM containing L-arginine- ${}^{13}C_{6}$ - ${}^{15}N_4$  and L-lysine- ${}^{13}C_{6}$ - ${}^{15}N_2$ . At a confluency of ~90%, medium-labeled WT cells were treated for 16 h with the respective HDACIs, whereas light-labeled WT and heavy-labeled KO cells were mock-treated with DMSO and H<sub>2</sub>O, respectively. All experiments were performed in at least two biological replicates. Cells were harvested as described above, lysed and proteins were mixed in a 1:1:1 ratio prior to reduction with DTT, alkylation with chloracetamide and trypsin digestion, as described above.

Purification of peptides and enrichment of acetylated peptides. Digested protein samples were cleared for precipitates by centrifugation (2,500g, 5 min) and loaded onto reversed-phase C18 Sep-Pak columns (Waters), pre-equilibrated with 5 ml acetonitrile and  $2 \times 5$  ml 0.1% TFA. Peptides were washed with 0.1% TFA and H<sub>2</sub>O, eluted with 50% acetonitrile (ACN) and mixed with 100  $\mu$ l 10 $\times$  IAP buffer (500 mM MOPS; pH 7.2, 100 mM Na-phosphate, 500 mM NaCl). Subsequently, ACN was removed and volume of samples was adjusted to 1 ml by H<sub>2</sub>O. For proteome analysis, small aliquots of total peptides were fractionated using micro-SCX columns in a stage-tip format<sup>55</sup>. Peptide fractions were purified and concentrated with reversed-phase StageTips as described<sup>55</sup>. For acetylation enrichment, modified peptides were immunoenriched using anti-acetyllysine antibodies (40  $\mu$ l/IP) as described previously<sup>22</sup>. Enriched peptides were fractionated and purified as described for proteome samples. Peptides were eluted with 40 µl of buffer B (60% ACN, 0.1% TFA) and organic solvent was removed in a SpeedVac concentrator. The final sample volume was adjusted to 7 µl with buffer A\* (0.5% acetic acid, 0.2% TFA).

**Mass spectrometric analysis.** Peptide fractions were analyzed by online nanoflow LC-MS/MS with a Proxeon easy nLC system (Thermo) connected to a Q Exactive mass spectrometer (Thermo) as described previously<sup>56</sup>. Briefly, peptide samples were loaded onto C18 reversed-phase chromatography columns (length 15 cm, inner diameter 75  $\mu$ m) and eluted with a linear gradient of 6–40% ACN/H<sub>2</sub>O containing 0.5% acetic acid. Eluted peptides were ionized by electrospray-ionization and measured in the mass spectrometer. Typical mass spectrometric conditions were: spray voltage: 2.0 kV, no sheath and auxiliary gas flow, heated capillary temperature: 275 °C. The Q Exactive under Xcalibur 2.2 with LTQ Orbitrap Tune Plus Developers Kit version 2.6.0.1042 software was operated in data-dependent mode to automatically switch between MS and MS2 acquisitions as described previously<sup>57</sup>.

**Peptide identification and quantification.** All MS data were analyzed with MaxQuant (development version 1.2.7.1)<sup>58</sup>. All SILAC pairs were quantified and MS/MS spectra were searched against the human Uniprot FASTA database (released in February 2012) to identify corresponding proteins. The false-discovery rate (FDR) was fixed to a threshold of 1% FDR at peptide and protein level and all peptide identifications were filtered for length and mass error. FDR was estimated using a target-decoy database search approach<sup>59</sup>. Cysteine carbamidomethylation was searched as a fixed modification, whereas methionine oxidation, N-acetyl protein and acetylation of lysine were chosen as variable modifications.

**Immunofluorescence microscopy.** HeLa cells were treated without or with bufexamac (50 and 250  $\mu$ M) for 4 h at 37 °C. Subsequently, cells were fixed by 2% paraformaldehyde (PFA) in PBS and permeabilized with 0.2% Triton-X in PBS. After blocking with 5% bovine serum albumin (BSA) in PBS, cells were incubated with primary antibody (anti-acetyl-tubulin and anti-HIF1- $\alpha$ ) and subsequently with anti-rabbit secondary antibody coupled to Alexa Fluor 488 and 568 (Molecular Probes). Cells were mounted by using DAPI containing Vectashield-mounting medium (Vector labs). Confocal images were acquired on an LSM-780 (Carl Zeiss Microimaging Inc.) mounted on Zeiss-Axiovert 100M equipped with Plan-Neofluar 40×/1.3 oil immersion objective.

Luciferase assays. HeLa cells were transfected with hypoxia responsive element-luciferase plasmid (Addgene; plasmid no. 26731; ref. 60) and treated as indicated. Activation of hypoxia response elements was determined by measuring luciferase activity using the Dual-Glo Luciferase Kit (Promega) according to the manufacturer's protocol.

QPCR. HeLa cells were pretreated without or with bufexamac (50 and 250 µM) and Desferoxamine mesylate (200 µM), and subsequently RNA was isolated using the Qiagen RNeasy kit (Qiagen), according to manufacturer's protocol. The same procedure was used to obtain RNA from WT and KO MEF cells. Total RNA was quantified using a nano-drop spectrophotometer (Thermo) and complementary DNA (cDNA) was synthesized using the QuantiTect Rev. Transcription kit (Qiagen). Reverse transcription reactions were diluted 1:5 with H<sub>2</sub>O and stored at -20 °C. Quantitative PCR was performed using a Stratagene Mx3005P instrument. Experimental data were analyzed with MxPro software. Sample setup and QPCR reactions were performed as described<sup>61</sup>. For each QPCR reaction run a glyceraldehyde-3-phosphate dehydrogenase (Gapdh) standard curve was prepared by 1,000-fold serial dilution (10× at each point), and the PCR efficiency was determined. The PCR efficiency was then used to calculate the abundance of cDNA for the target gene relative to Gapdh. The following primers (Hs, Homo sapiens; Mm, Mus musculus) were used for QPCR: HsGapdh, forward: 5'-CAGCGACACCCACTCCTCCA-3' and reverse: 5'-GCTGGTGGTCCAGGGGTCTT-3'; HsVegfA, forward: 5'-CGAGACTCCGGCGGAAGCAT-3' and reverse: 5'-CGGCCGCGGTG TGTCTACAG-3'; MmGapdh, forward: 5'-TCCATGACAACTTTGGCATTG-3' and reverse: 5'-CAGTCTTCTGGGTGGCAGTGA-3'; MmSirt2, forward: 5'-CGAAGGAGTGACACGCTACATG-3' and reverse: 5'-GGTGGTACTT CTCCAGGTTTGC-3'; MmSirt6, forward: 5'-CAGTACGTCAGAGACACGG TTG-3' and reverse: 5'- GTCCAGAATGGTGTCTCTCAGC-3'.

**Immuno-blotting.** For immunoblotting, protein lysates were prepared in modified RIPA buffer and protein amounts measured by Bradford assay. Equal amounts of proteins were precipitated by ice-cold acetone and precipitated proteins were recovered by centrifugation (20.000g, 2 min, 4 °C). Proteins were redissolved in 4× sample buffer containing 100 mM DTT, and separated on NuPAGE Novex 4–12% Bis-Tris gels (Invitrogen) and visualized by immuno-staining with the indicated antibodies.

**Immunoprecipitation of SMC3.** HeLa cells were treated with different concentrations of PCI34501, washed with PBS, lysed with IP-wash buffer (5 mM MgCl<sub>2</sub>, 1 mM CaCl<sub>2</sub>, 1 mM EDTA, 0.1% Triton X-100 in PBS; pH 7.4, supplemented with complete protease inhibitor mix (Roche)) containing 1% Triton X-100 and clarified by centrifugation (20,000g, 15 min, 4 °C)). For detection of HDAC8 inhibitor–dependent acetylation of SMC3, protein G magnetic Dynabeads (Dynal) were pre-loaded with anti-SMC3 antibody for 2 h at 4 °C. Control immunoprecipitations were performed using an antibody against c-Myc epitope tag. After coating, beads were washed three times with ice-cold IP-wash buffer. Subsequently, beads were incubated for 2 h at 4 °C with cell lysates. After washing three times with immunoprecipitation wash buffer and three times with cold PBS, proteins were eluted with 50 µl SDS sample buffer for 10 min at 65 °C. Eluates were analyzed by SDS-PAGE and subsequent immunoblotting using a pan-anti-acetyllysine antibody.

**Determination of cell death.** Human promyelocytic leukemia (HL-60) cells (ATCC: CCL-240) were treated as indicated. Subsequently, cell viability was determined using propidium iodide (PI) staining solution (Cayman Chemical Company). Cells were stained according to the manufacturer's protocol and PI fluorescence was measured in a plate reader.

**Iron binding assay.** Bufexamac (5 mM in methanol) and desferoxamine mesylate (5 mM in methanol) were titrated in 2  $\mu$ l increments into 500  $\mu$ l of a 100  $\mu$ M methanolic FeCl<sub>3</sub> solution, and iron-complex formation was measured at a wavelength of 490 nm using a Varian Cary 50Bio UV-Vis

spectrophotometer. Absorption was plotted against chelator concentration and fitted to a Langmuir (1:1) isotherm

$$\left[y = \alpha * \frac{x}{K_D + x}\right]$$

to derive the dissociation constant ( $K_D$ ). All binding assays were performed using methanol as solvent due to very low solubility of bufexamac in aqueous solutions, and thus, these  $K_D$  values may differ from values in aqueous solutions.

**Data analysis.** Statistical analysis was performed using the R software environment (http://www.r-project.org/), and biochemical data were analyzed using Graphpad Prism (version 5). Gene ontology (GO) term enrichment was calculated using Fisher exact test. *P* values were adjusted for multiple hypotheses testing using the FDR method. Protein interaction network analysis was performed using interaction data from the STRING database (version 9)<sup>62</sup>. Only interactions with a STRING score above 0.7 are represented in the network, and visualized using Cytoscape<sup>63</sup> and ClueGO/GOlorize plug-ins<sup>64,65</sup>.

**Site-based clustering of inhibitors.** To define an acetylation site-based similarity of two inhibitors, we selected the sites that were identified for both KDACIs and showed increased acetylation (SILAC ratio >2) for at least one of the two inhibitors. We next log-transformed the ratios and defined the similarity as the Pearson correlation. We used this definition to calculate an all-against-all similarity matrix for the 19 inhibitors. Based on this similarity matrix, we performed average linkage clustering using the using the OC software (http://www. compbio.dundee.ac.uk/downloads/oc/). Finally, we visualized the resulting cluster tree as an unrooted tree using iTOL (http://itol.embl.de/).

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