# Proteome-wide mapping of cholesterol-interacting proteins in mammalian cells

Jonathan J Hulce, Armand B Cognetta, Micah J Niphakis, Sarah E Tully & Benjamin F Cravatt

Cholesterol is an essential structural component of cellular membranes and serves as a precursor for several classes of signaling molecules. Cholesterol exerts its effects and is, itself, regulated in large part by engagement in specific interactions with proteins. The full complement of sterol-binding proteins that exist in mammalian cells, however, remains unknown. Here we describe a chemoproteomic strategy that uses clickable, photoreactive sterol probes in combination with quantitative mass spectrometry to globally map cholesterol-protein interactions directly in living cells. We identified over 250 cholesterol-binding proteins, including receptors, channels and enzymes involved in many established and previously unreported interactions. Prominent among the newly identified interacting proteins were enzymes that regulate sugars, glycerolipids and cholesterol itself as well as proteins involved in vesicular transport and protein glycosylation and degradation, pointing to key nodes in biochemical pathways that may couple sterol concentrations to the control of other metabolites and protein localization and modification.

The membrane bilayer serves as a physical barrier that defines the outer boundary of cells and segregates their interior into distinct compartments that perform specialized functions. Among the many lipid constituents of mammalian cell membranes, cholesterol is special in that it is a major regulator of membrane fluidity and contributes to the formation of specific membrane structures such as caveolae and other lipid microdomains1. Beyond its role in membrane structure, cholesterol also serves as a metabolic precursor for a diverse array of signaling molecules, including oxysterols<sup>2</sup>, steroids<sup>3</sup> and bile acids<sup>4</sup>. Deregulation of cholesterol uptake and metabolism is the basis for a range of human diseases that include cardiovascular disorders<sup>5</sup>, skin<sup>6</sup> and developmental<sup>7,8</sup> defects, syndromes resulting from defective lysosomal storage<sup>9,10</sup> and neurodegeneration<sup>10,11</sup>.

Cholesterol's central role in mammalian physiology mandates that the concentrations of this lipid are tightly regulated in cells. Meeting this objective poses an unusual challenge for cells because the vast majority of cholesterol is embedded in the lipid bilayer. Multiple sterol-sensing pathways have been identified that communicate alterations in the membrane concentrations of cholesterol to the transcriptional and post-transcriptional control of sterol biosynthetic, uptake and transport pathways<sup>12–14</sup>. Beyond these primary control points, cholesterol has also been found to interact with other proteins by both covalent 15 and noncovalent mechanisms <sup>16,17</sup>. These cholesterol-protein interactions are thought to regulate protein stability, localization and activity.

Despite the tremendous progress that has been made in characterizing specific cholesterol-protein interactions, our understanding of the full spectrum of proteins that regulate, and are regulated by, cholesterol remains incomplete, in large part owing to a lack of global methods for mapping proteins that physically interact with sterols in living cells. The biochemical assessment of cholesterol-protein interactions has, to date, been restricted to a limited canon of assays that include direct in vitro binding using radiolabeled cholesterol and purified proteins 18 and modification of proteins with radiolabeled photoreactive cholesterol analogs<sup>19,20</sup>. Although these methods have been used to successfully characterize individual protein-cholesterol interactions, the approaches also lack key features, most notably a means for affinity enrichment, that have precluded their incorporation into chemoproteomic platforms for the global discovery of sterolbinding proteins in mammalian cells.

Here we expand the repertoire of available methods for mapping sterol-binding proteins by introducing a chemoproteomic approach to label, enrich and identify cholesterol-interacting proteins from living cells. We applied this approach to identify more than 250 cholesterol-binding proteins in HeLa cells, including several proteins that are known to biosynthesize, transport and regulate cholesterol, as well as many proteins for which no prior interaction with cholesterol has been described.

#### **RESULTS**

## Design of clickable, photoreactive sterol probes

We reasoned that chemoproteomic probes for mapping cholesterol-binding proteins in living cells would need to have three general features: (i) a photoreactive group for ultraviolet (UV) light-induced cross-linking to probe-interacting proteins, (ii) a latent affinity handle, such as an alkyne group for conjugation to azide-reporter tags by copper-catalyzed azide-alkyne

The Skaggs Institute for Chemical Biology and Department of Chemical Physiology, The Scripps Research Institute, La Jolla, California, USA. Correspondence should be addressed to B.F.C. (cravatt@scripps.edu).





cycloaddition (CuAAC or click) chemistry<sup>21</sup>, which enables detection, enrichment and identification of probe-interacting proteins<sup>22</sup>, and (iii) an intact cholesterol scaffold, such that after integration of photo-cross-linking and 'clickable' groups, the resulting probe could still interact with most cholesterol-binding proteins. With these considerations in mind, we designed and synthesized a set of sterol probes (Fig. 1a), each of which contains a photoactivatable diazirine group at the 6 position of the steroid core (using standard numbering), which is a modification that previously has been shown to minimally perturb the biophysical properties of cholesterol<sup>23</sup>. The probes also have an alkyne incorporated into the alkyl side chain of cholesterol via an ester linkage, which we chose for ease of synthesis. Although this ester linkage would be expected to increase the polarity of the alkyl side chain, we favored this modification over additional perturbations to the steroid core, which we believed should serve as the major basis for recognition for a large fraction of cholesterol-binding proteins. The sterol probes, named cis-sterol, trans-sterol and epi-sterol, differ in the diastereomeric relationship between the C3-alcohol and C5-hydrogen groups appended to the cholesterol core, and we synthesized them from a common precursor, the bile acid hyodeoxycholic acid (Supplementary Note).

We obtained X-ray structures of the keto-acid intermediates corresponding to each cholesterol probe to verify their relative and absolute stereochemistry (Fig. 1b). As compared to the threedimensional structure of cholesterol (extracted from a structure<sup>24</sup> in complex with NPC1; Fig. 1b), the trans-sterol probe exhibited the most similarity to cholesterol in terms of stereochemistry and molecular topology. Owing to its 3α-OH stereochemistry, the *epi*sterol probe instead most resembled epicholesterol. Although the cis-sterol probe appeared bent in the crystal structure (Fig. 1b), it is probably the most flexible of the probes because of its structurally distinct *cis*-decalin-type A-B ring fusion<sup>25</sup>. This ring fusion stereochemistry, along with its  $3\alpha$ -OH stereochemistry, likely allows for the *cis*-sterol probe to adopt bent cholesterol-like conformations in solution that retain the equatorial orientation of the C3 hydroxyl group.

## Gel profiling of sterol-binding proteins in human cells

We first assessed sterol probe labeling of cellular proteins using SDS-PAGE analysis (Fig. 2a and Online Methods). Probe labeling for virtually all detected proteins was UV irradiation-dependent (Fig. 2b), indicating that these interactions reflect noncovalent binding events (versus the posttranslational modification of proteins by cholesterol, as has been reported in select instances<sup>15</sup>). We observed concentration-dependent increases in protein labeling for all three probes (1-20 µM probe), with the cis-sterol and trans-sterol probes showing stronger overall protein-labeling profiles compared to the epi-sterol probe (Fig. 2c). In subsequent experiments we used conditions that produced substantial but submaximal labeling (10 µM probe).

We found that the protein-labeling profiles for all three sterol probes were competed to variable degrees by excess cholesterol (1×, 5× or 10× cholesterol supplemented as a methyl- $\beta$ -cyclodextrin (m $\beta$ CD) complex to enhance water solubility), with the *cis*-sterol probe showing the greatest sensitivity (**Fig. 2d**). Steroids or sterols with structures similar to that of cholesterol also blocked many of the protein-labeling events observed for

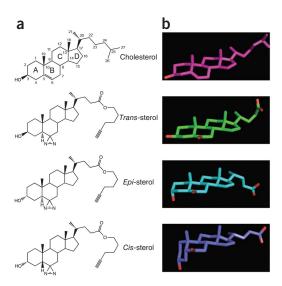


Figure 1 | Clickable photoreactive sterol probes. (a) Structures of cholesterol and three diastereomeric sterol chemoproteomic probes. Standard numbering and ring designations (A, B, C and D) are shown for cholesterol. (b) Three-dimensional structures of cholesterol and sterol probes as determined by X-ray crystallography; cholesterol structure is derived from Protein Data Bank (PDB) 3GKI (ref. 24).

the trans-sterol probe, whereas structurally less-related steroids exhibited little or no competition (**Supplementary Fig. 1**).

## Mass spectrometry profiling of sterol-binding proteins

We aimed to characterize sterol-binding proteins, using methods based on biotin-streptavidin affinity coupled with stable-isotope labeling by amino acids in cell culture (SILAC) mass spectrometry<sup>26</sup>, so that we could distinguish with precision proteins that specifically interact with sterol probes and assess the sensitivity of these interactions to competition by excess cholesterol (Fig. 3a). For our initial analyses, we treated heavy isotopelabeled ('heavy') HeLa cells with the *trans*-sterol probe (20 μM) for 30 min and irradiated the cells with UV light (5 min), whereas light isotope-labeled ('light') cells received either no probe treatment before exposure to UV light (vehicle control) or received the trans-sterol probe (20 µM) but were not irradiated (no-UV light control). We collected the cells, mixed their heavy and light proteomes 1:1, conjugated probe-labeled proteins to an azidebiotin tag by CuAAC and enriched these proteins using streptavidin chromatography. Then we digested the enriched proteins on-bead with trypsin and analyzed the resulting tryptic peptide mixture by liquid chromatography-mass spectrometry (Online Methods). Proteins that exhibited heavy:light SILAC ratios ≥ 5 for trans-sterol probe versus both vehicle and no-UV light control reactions were designated as 'sterol-interacting proteins'. About 850 proteins met these criteria (Fig. 3b and Supplementary Tables 1 and 2).

We next compared the proteome-labeling profiles of the *trans*-sterol probe with the *cis* and *epi*-sterol probes by SILAC. The mean labeling intensity ratio for probe-enriched proteins in the *trans*-sterol probe versus *cis*-sterol probe comparison was 0.9 (s.d. = 0.57; Supplementary Fig. 2), indicating that the trans and cis-sterol probes display similar protein-interaction profiles in cells. In contrast, for the trans versus epi-sterol





Figure 2 | Gel-based profiling of sterol-binding proteins in HeLa cells. (a) Scheme for treatment of live cells with sterol probes and competitive treatments. (b) SDS-PAGE analysis of HeLa cells treated with 10 μM trans-sterol probe, with and without 365-nm UV irradiation before click chemistry. (c) Concentration-dependent labeling of live HeLa cells with each probe at indicated concentrations. (d) Competition of sterol probe labeling profiles (10  $\mu$ M probes) with cholesterol at 0  $\mu$ M, 10  $\mu$ M (1×), 50  $\mu$ M (5×) and 100  $\mu$ M (10×).

probe comparison, the mean ratio (2.1) as well as the standard deviation (1.2) were much higher (Supplementary Fig. 2), suggesting that the stereochemistry of the sterol hydroxyl group impacts probe-protein interactions in a variable manner.

Nearly 700 of the identified sterol-binding proteins showed strong selectivity (≥ threefold higher signals) for the *trans*-sterol probe over a nonsteroidal neutral lipid probe containing a diazirine and alkyne group embedded in an N-palmitoylethanolamine structure (*N*-palmitoylethanolamine-diazirine-alkyne (PEA-DA; Supplementary Note)) (Fig. 3c and Supplementary Table 1). Only 18 proteins from the sterol-binding group showed the opposite profile, exhibiting greater labeling with the PEA-DA probe (heavy/light signal ratio < 1.0; Fig. 3c).

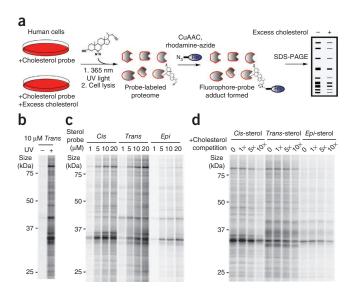
Next we performed competitive profiling experiments, evaluating the *trans*-sterol probe for protein labeling in cells treated with excess cholesterol. We treated light and heavy HeLa cells with the trans-sterol probe (10  $\mu$ M) in the presence or absence of 10× (100 µM) cholesterol, respectively. Approximately 300 proteins showed at least a 50% decrease in trans-sterol probe labeling intensity in cells treated with excess cholesterol (Fig. 3d and Supplementary Table 3). Over 250 of these cholesterol-sensitive targets also showed selective labeling by the *trans*-sterol probe compared to the PEA-DA probe (Supplementary Table 1), and the majority (>60%) of the competed proteins also showed evidence of cholesterol competition in experiments performed with the cis-sterol probe (Supplementary Fig. 3). We also performed parallel DNA microarray experiments and found that cholesterolsensitive proteins, in general, exhibited no evidence of gene expression changes at the 30 min time point of competitive analysis (Supplementary Fig. 4 and Supplementary Table 4).

Finally, as a control for incorporation of the heavy amino acids in our SILAC experiments, we treated heavy and light HeLa cells each with 20 µM trans-sterol probe, and combined and processed their proteomes as described above. The overall median and mean SILAC ratio for proteins detected in this experiment was 1.0 (Supplementary Table 3), indicative of > 95% heavy amino acid incorporation, and therefore ratios from other SILAC studies are presented without any correction factors.

Together, these quantitative mass spectrometry experiments enabled us to distribute the proteins that interacted with the trans-sterol probe into four groups: group I, which were both sensitive to cholesterol competition and selective for the transsterol probe over the PEA-DA probe (265 proteins); group II, which were sensitive but not selective (34 proteins), group III, which were selective but not sensitive (411 proteins), and group IV, which were neither sensitive nor selective (140 proteins) (Fig. 3e and Supplementary Table 1).

## Analysis of group I cholesterol-binding proteins

Our detailed analysis of 265 group I proteins included both computational and experimental inquiries. We first noted that group



I contains many proteins that are known to bind to cholesterol. These include Scap<sup>12</sup>, caveolin (CAV1)<sup>16</sup>, tetraspanin CD82 (ref. 20), the sterol transport protein ARV1 (ref. 27) and the sterol biosynthetic enzyme HMG-CoA reductase<sup>17</sup>, which is known to be regulated by cholesterol through allosteric binding<sup>17,18</sup> (Supplementary Table 5). We found that the trans-sterol probe interacted with many other enzymes in the sterol biosynthetic pathway (Fig. 3f,g). FDFT1 and SQLE, two upstream enzymes in the sterol biosynthetic pathway that do not directly handle sterols as substrates or products were identified in group I (Fig. 3g), indicating that they may, like HMG-CoA reductase, interact with cholesterol through an allosteric mechanism. Groups II-IV also contained additional proteins known to interact with cholesterol, including, for instance, the lysosomal sterol transporter NPC1 (ref. 24) (Supplementary Table 5).

A broader survey of group I revealed that it contains representatives from virtually all major classes of proteins, including G protein-coupled receptors (a class of receptors that have been proposed to bind cholesterol to stabilize certain functional conformations<sup>28</sup>), ion channels, transporters and enzymes (Fig. 4a). Automated Kyoto Encyclopedia of Genes and Genomes (KEGG) pathway and Database for Annotation, Visualization and Integrated Discovery (DAVID) analysis tools<sup>29,30</sup> identified several types of proteins that were enriched in group I beyond the aforementioned sterol biosynthetic enzymes, including glycerophospholipid metabolic enzymes, protein glycosylation and degradation pathways, and protein networks that regulate membrane structure and dynamics (Fig. 3f). When considered in relation to human disease by analysis with the Online Mendelian Inheritance in Man (OMIM) database, group I was most highly enriched in proteins linked to neurological disorders as well as cardiovascular and metabolic diseases (Fig. 4b). Group I also contained a substantial number of proteins of uncharacterized function (Fig. 4a), including several that cluster into sequence-related sub-families (such as YIF1A/YIF1B, FNDC3A/FNDC3B, UNC84A/UNC84B, DPY19L1/DPY19L4, FAM114A1/FAM114A2 and FAM134A/ FAM134B/FAM134C; Supplementary Table 1).

Evaluation of the subcellular distribution of group I proteins revealed, perhaps not surprisingly, that the vast majority (87%) are known or predicted integral membrane proteins (Fig. 4c).



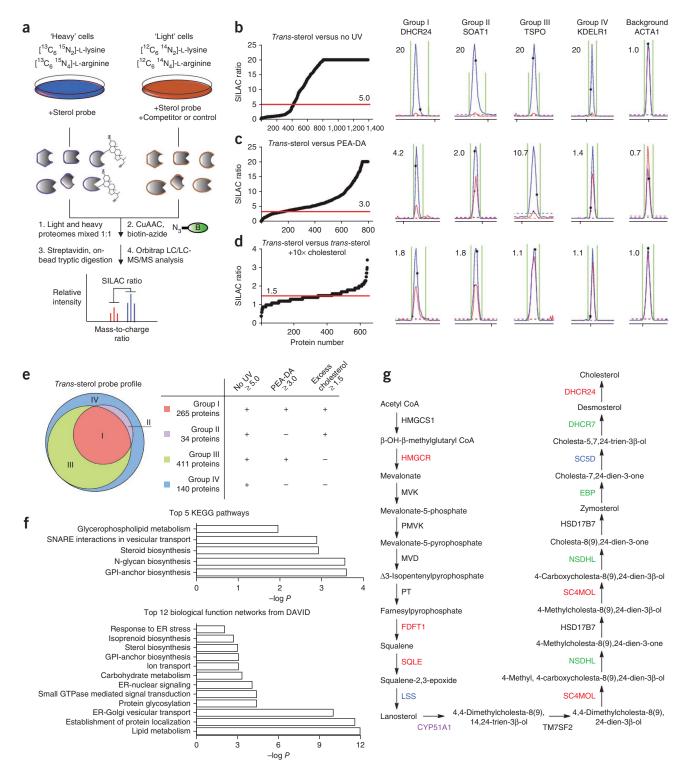


Figure 3 | Mass spectrometry-based profiling of sterol-binding proteins in HeLa cells. (a) Scheme for enrichment and analysis of sterol probe labeling profiles in mammalian cells by biotin-streptavidin methods and SILAC mass spectrometry analysis. (b-d) Heavy/light SILAC ratio plots (left; data in black) for total proteins identified in experiments in which we compared labeling profiles of the trans-sterol probe versus no-UV light control (b; 20 μM trans-sterol probe over 20 μΜ trans-sterol probe with no UV irradiation), the PEA-DA probe (c; 20 μM trans-sterol probe over 20 μM PEA-DA probe), and 10× cholesterol competition (d; 10 μM trans-sterol probe over 10 µM trans-sterol probe + 100 µM cholesterol). Red lines indicate threshold ratio values. Representative parent-ion mass (MS1) traces from each SILAC experiment (right) with calculated ratios indicated in the plots (ratios of ≥20 are listed as 20) for sterol-interacting proteins that fall into groups I-IV and for a nonspecific background protein. Blue traces denote the heavy (10 μM or 20 μM trans-sterol) trace; red traces denote the light (control or competed) trace; green lines designate the integration range for each peak quantification. (e) Distribution of group I-IV proteins for the trans-sterol probe labeling profile, with a summary of each group's threshold SILAC ratio requirements across each experiment. (f) Top 5 pathways determined by searching group I proteins in the KEGG database, and top 12 biological function networks determined by searching group I proteins in the DAVID gene ontology server. (g) Trans-sterol probe labeling profile for the cholesterol biosynthetic pathway, with colors (as in e) reflecting each enzyme's group designation (black, not detected).



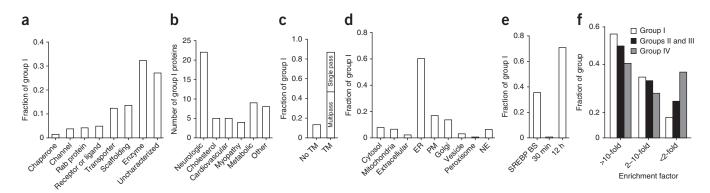


Figure 4 | Analysis of group I proteins. (a) Biochemical functions of group I proteins. (b) Group I proteins known to be genetically associated with human disease based on the OMIM database; the 'cholesterol' group represents diseases from all other groups that are known to manifest via aberrant cholesterol homeostasis, (c) Fraction of group I proteins that have known or predicted transmembrane (TM) domains, TM proteins are divided into singlepass versus multipass TM proteins. (d) Known or predicted subcellular localization of group I proteins. NE, nuclear envelope. Subcellular localization predictions were made by examining protein sequences using the PSORT II algorithm (http://psort.hgc.jp/form2.html). (e) Cholesterol regulation of group I proteins at the mRNA level. 'SREBP BS' denotes the fraction of group I proteins with SREBP transcription factor binding sites in the gene/ promoter regions based on the Qiagen SABiosciences transcription factor database (http://www.sabiosciences.com/chipqpcrsearch.php?app=TFBS). The '30 min' and '12 h' labels denote the fraction of group I proteins with substantial (≥twofold) changes in mRNA levels after 100 μM cholesterol treatment for the indicated duration. (f) Enrichment (<2-fold, 2-10 fold and >10-fold) of group I, group II and III, and group IV proteins in trans-sterol probe data sets compared to their abundance in unenriched membranes.

These proteins were near-equally distributed between single-pass and multipass transmembrane proteins (Fig. 4c), and were dispersed across all subcellular membrane compartments with a notable enrichment in known or predicted endoplasmic reticulum (ER) proteins (Fig. 4d). Even though only 13% of proteins in group I were soluble proteins, the composition of this subset of proteins is intriguing: they include three kinases (HK1, HK2 and ADPGK) that convert glucose to glucose-6-phosphate, a key metabolic substrate for glycolysis and the pentose phosphate pathway. Both HK1 and HK2 are known to associate with cholesterol-rich regions of the mitochondria, although historically this interaction has been suggested to occur indirectly through binding VDAC channels<sup>31</sup>. Our chemoproteomic data indicate that HK1 and HK2 may also interact directly with cholesterol to facilitate their binding to mitochondria.

Cholesterol is known to regulate the expression of a large and diverse set of genes primarily through the Scap/SREBP system<sup>12,14</sup>. As noted above, very few of the group I proteins exhibited evidence of gene expression changes at the 30 min time point of our chemoproteomic analyses. About 35% of the group I proteins, however, have predicted SREBP transcription factor-binding sites in the promoter regions of their genes, and we determined that ~70% of these proteins exhibited at least a 100% increase or 50% decrease in their corresponding mRNA amounts 12 h after treatment of HeLa cells with cholesterol (100 µM) (Fig. 4e, Supplementary Fig. 4, Supplementary Tables 1 and 4). These data suggest that many proteins may be regulated by cholesterol at both the transcriptional (gene expression) and post-transcriptional (direct binding) levels.

We finally evaluated the extent to which our chemoproteomic method facilitated the enrichment and detection of sterolbinding proteins compared to analyses performed in unenriched proteomes. Group I proteins showed an average of 11 and 80 spectral counts in unenriched and probe-enriched proteomes, respectively, equating to an average enrichment factor of 7.3 (Supplementary Table 6). Additionally, more than 50% of group I proteins were enriched more than tenfold (and conversely fewer than 10% of these proteins were enriched less than twofold) in the trans-sterol probe data sets (Fig. 4f). We also observed no positive correlation between a protein's absolute spectral count values in the unenriched versus trans-sterol probe-enriched samples (Supplementary Fig. 5), indicating that group I proteins were not biased toward abundant integral membrane proteins.

#### Experimentally validating cholesterol-protein interactions

To validate seven representative group I proteins, including six previously unidentified sterol-binding proteins, we recombinantly expressed the proteins in HeLa cells and treated these cells with the trans-sterol probe, followed by CuAAC coupling to an azide-rhodamine tag, separation of proteins by SDS-PAGE and detection of probe-labeled proteins by in-gel fluorescence scanning (Supplementary Fig. 6). We also confirmed that these sterol-protein interactions were competitively inhibited by excess cholesterol without alterations in expression of the recombinant proteins (**Supplementary Figs. 6** and 7).

## **DISCUSSION**

Our strategy to map sterol-binding proteins on a global scale operates in living cells, which is important, given that the transport of cholesterol to discrete subcellular compartments and membrane microdomains is controlled by complex transport machinery<sup>1</sup>. This work thus builds on and extends previous efforts that used radioactive, photo-cross-linking probes<sup>19,20</sup> by providing a means to not only detect but also affinity-enrich and identify sterolbinding proteins from mammalian cells.

We should also mention some potential limitations of our approach and ways to address these shortcomings in the future. First, our initial set of probes may not detect certain sterol-protein interactions that are impaired by the diazirine and/or esterified alkyne modifications to the structure of cholesterol. The ester linkage might also be susceptible to cleavage by endogenous esterases, which could reduce the sensitivity of our proteomic profiles. These problems could be addressed by creating probes in which the diazirine is moved to other locations on the sterol backbone and the esterified alkyne is replaced by distinct linkage chemistries. It might also be valuable to tailor probes to target proteins that bind to specific subsets of sterols (oxysterols<sup>2</sup>, bile acids<sup>4</sup>, steroids and others) as well as to perform competitive profiling where sterol analogs or other small molecules are tested for their ability to block specific sterol-protein interactions. We furthermore do not yet understand how, in most instances, sterol probes bind to their target proteins: developing a method to map the precise sites of sterol cross-linking to proteins would be valuable, and we note that the ester modification in our probe structures could provide a means to selectively release (through base hydrolysis) sterol-modified peptides from affinity-enrichment matrices. It would also be interesting to extend our analysis to other cell types and conditions (such as cells treated with statins or other cholesterol-lowering reagents), which could identify additional sterol-interacting proteins. Finally, we focused most of our attention in this study on group I proteins because they exhibited evidence of both selective binding to sterols over other lipids and sensitivity to cholesterol competition; however, groups II-IV also contain proteins known to interact with cholesterol. We do not know why cholesterol did not compete trans-sterol probe labeling of known sterol-binding proteins such as NPC1, but we observed competition for NPC1 with the cis-sterol probe (competition ratio = 2.1). Such probe-dependent variations in cholesterol competition could reflect differences in the local concentration of individual probes and/or cholesterol in specific organelles such as the lysosome or they may reflect differences in protein affinities for probes versus cholesterol. Regardless, that we found bona fide cholesterol-interacting proteins in groups I, II and III underscores the importance of considering the potential biological relevance for the entire >800 sterol-protein interactions reported here.

#### **METHODS**

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

Note: Supplementary information is available in the online version of the paper.

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#### **AUTHOR CONTRIBUTIONS**

J.J.H., S.E.T., M.J.N. and B.F.C. designed experiments; J.J.H., A.B.C. and S.E.T. performed experiments; J.J.H. and B.F.C. analyzed data; J.J.H. and B.F.C. wrote the manuscript.

#### **COMPETING FINANCIAL INTERESTS**

The authors declare no competing financial interests.

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#### **ONLINE METHODS**

Chemical probe synthesis. See Supplementary Note.

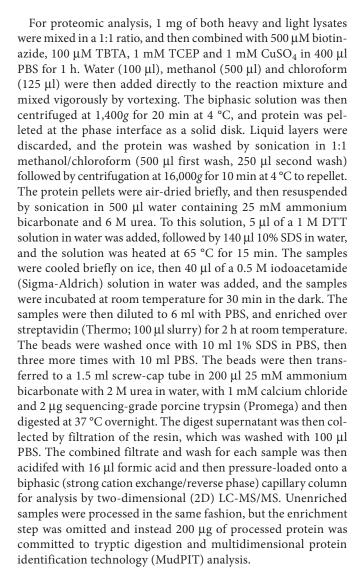
Cell culture and live cell labeling. HeLa cells were grown at 37 °C under a humidified 5% CO<sub>2</sub> atmostphere, in a culture medium consisting of high-glucose DMEM (HyClone) supplemented with 10% FBS (Gemini), and penicillin, streptomycin and glutamine (PSQ; Cellgro). For SILAC experiments, the culture medium was replaced with SILAC DMEM (Thermo) supplemented instead with 10% dialyzed FBS, PSQ and 100 µg/ml [ $^{13}\mathrm{C_6},^{15}\mathrm{N_4}$ ]L-arginine-HCl and [ $^{13}\mathrm{C_6},^{15}\mathrm{N_2}$ ]L-lysine-HCl (Sigma-Aldrich). Cells were passaged at least six times in isotopecontaining medium before being used for analysis by liquid chromatography–tandem mass spectrometry (LC-MS/MS).

To facilitate delivery to cells, all sterols and steroids, including the sterol probes, were complexed in aqueous solution to mβCD (Sigma-Aldrich) for at least 12 h before dilution in culture medium for labeling at working concentrations indicated in the main text, adapted from published procedures<sup>32</sup>. The desired amount of sterol or steroid was added to a saturated aqueous mβCD (38 mM) solution to generate a concentrated stock, and the mixture was agitated at room temperature overnight; solutions were filtered before use the following day. Aqueous stock solutions of the trans-sterol probe were prepared at 2 mM; the cis-sterol and epi-sterol probes were prepared at 1.2 mM; cholesterol and other sterols for competition were prepared at 4 mM; steroids were prepared at 5 mM. Nonsteroidal lipids,  $C_{17}$ -MAGE and di-C<sub>15</sub>-DAG, as well as the PEA-DA probe were suspended in DMSO (10 mM) and diluted to working concentrations directly in culture medium.

Before live-cell labeling, aqueous stock solutions of each sterol probe or competitor (or DMSO stock solution of lipids) were combined in opaque centrifuge tubes and then diluted to final working concentrations in culture medium under dim ambient light. Unmodified culture medium was then removed from the cells and replaced with probe-containing medium. Cells were then incubated at 37 °C for 30 min in the dark to load the cells with sterol probe and competitors. After this time, cells were washed quickly with cold PBS and then irradiated for 5 min in cold PBS under 365-nm UV light in a FB-UVXL-1000 UV cross-linker (Fisher). Cells were then collected by scraping, and the cell pellet was frozen at -80 °C until processing for gel or LC-MS/MS analysis.

Sample processing for analysis by SDS-PAGE or LC-MS/MS.

Frozen cell pellets were thawed on ice and lysed in PBS by sonication. Protein concentrations of cell lysates were determined using the BCA protein assay on a microplate reader. Click chemistry was then performed as previously described directly in whole-cell lysates in PBS. For analysis by gel, 50  $\mu g$  of protein was used, adjusted to a protein concentration of 1 mg/ml (50  $\mu$ l), and mixed with 20  $\mu M$  rhodamine-azide, 1 mM Tris(2-carboxyethyl)phosphine (TCEP, Sigma-Aldrich), 100  $\mu M$  Tris[(1-benzyl-1H-1,2,3-triazol-4-yl)methyl]amine (TBTA) (Sigma-Aldrich) and 1 mM CuSO<sub>4</sub> in PBS at room temperature. After 1 h, samples were mixed with SDS sample loading buffer and loaded without boiling on a 10% SDS-PAGE gel, separated and imaged using a Hitachi FMBIO-II flatbed fluorescence scanner. Fluorescence images are shown in grayscale.



Mass spectrometry and data processing. Mass spectrometry was performed using a Thermo Orbitrap Velos mass spectrometer. Peptides were eluted using a five-step multidimensional LC-MS (MudPIT<sup>34</sup>) protocol (using 0%, 25%, 50%, 80% and 100% salt bumps of 500 mM aqueous ammonium acetate, followed by an increasing gradient of aqueous acetonitrile and 0.1% formic acid in each step), and data were collected in data-dependent acquisition mode (two MS1 microscans (400-1800 mass to charge ratio (m/z)) and 30 data-dependent fragmentation (MS2) scans) with dynamic exclusion enabled (repeat count of 1, exclusion duration of 20 s) with monoisotopic precursor selection enabled. All other parameters were left at default values. Unenriched membrane preparations were eluted using the same chromatographic steps and instrument settings. SEQUEST<sup>35</sup> searches allowed for variable oxidation of methionine (+15.9949 m/z), static modification of cysteine residues (+57.0215 m/z; iodoacetamide alkylation) and no enzyme specificity. Each data set was independently searched with light and heavy parameter files; for the light search, all other amino acids were left at default masses; for the heavy search, static modifications on lysine ( $+8.0142 \, m/z$ ) and arginine  $(+10.0082 \, m/z)$  were specified. The precursor-ion mass tolerance was set to 50 p.p.m. and the fragment-ion mass tolerance was the



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default assignment of 0. The data were searched using a human reverse-concatenated nonredundant (gene-centric) FASTA database that combines International Protein Index (IPI) and Ensembl identifiers. The resulting matched MS2 spectra were assembled into protein identifications, then filtered using DTASelect (version 2.0.47), and only half-tryptic or fully tryptic peptides were accepted for identification, and only fully-tryptic peptides were considered for quantification. Peptides were restricted to a specified false positive rate of 1%. Redundant peptide identifications common between multiple proteins were allowed, but the database was restricted to a single consensus splice variant. SILAC ratios were quantified using in-house software as described (CIMAGE<sup>36</sup>). Briefly, extracted MS1 ion chromatograms (± 10 p.p.m.) from both 'light' and 'heavy' target peptide masses (m/z)were generated using a retention time window (± 10 min) centered on the time when the peptide ion was selected for MS/MS fragmentation, and subsequently identified. Next, the ratio of the peak areas under the light and heavy signals (signal-to-noise ratio > 2.5) are calculated. Computational filters used to ensure that the correct peak-pair is used for quantification include a co-elution correlation score filter ( $R^2 \ge 0.8$ ), removing target peptides with bad co-elution profile, and an 'envelope correlation score' filter  $(R^2 > 0.8)$  that eliminates target peptides whose predicted pattern of the isotopic envelope distribution does not match the experimentally observed high-resolution MS1 spectrum. Also, peptides detected as singletons, where only the heavy or light isotopically labeled peptide was detected and sequenced, but which passed all other filtering parameters, were given a standard ratio of 20, which is the maximum SILAC ratio reported here. All reported SILAC experiments were run in duplicate, except the cholesterol competition experiment, which was run in quadruplicate.

After automated processing, data sets were filtered and analyzed manually based on more stringent and experiment-specific criteria. Only proteins that showed at least two unique identified and quantified peptides between four control runs (transsterol probe versus vehicle and versus 'no UV', each in duplicate), and that showed at least ratio of 5.0 when the heavy, trans-sterol probe-enriched signal was compared to the background signal, were considered for subsequent analysis by comparison to the PEA-DA labeling profile, and to cholesterol competition. Only proteins that showed at least a ratio of 3.0 when trans-sterol probe-labeled cells were compared to PEA-DA-labeled cells were considered 'selective' and could be considered group III or higher, and only proteins that showed at least a ratio of 1.5 when competed by 10× cholesterol and showed at least two quantified unique peptides across four competition runs were considered 'sensitive' for subsequent analysis and consideration as group II or higher. All experimental SILAC ratios presented are the mean of the median ratios of all quantified peptides for each protein from each replicate for each experiment.

Meta-analyses (**Fig. 4**) of the sensitive and selective group of *trans*-sterol probe targets were performed using several online resources and servers. Automated gene ontology and pathway enrichment analyses were performed by uploading the group I protein list to the DAVID bioinformatics website and performing enrichment analyses. Protein annotations in **Figure 4** were obtained from primary literature sources, <a href="http://genecards.com">http://genecards.com</a>, the Qiagen SABiosciences transcription factor database and the

OMIM database. Transmembrane domains were predicted, as necessary, by PSORT II and TMHMM prediction servers.

Microarray analysis of cholesterol-induced transcriptional changes. To verify that the observed cholesterol competition was most likely due to direct physical competition of probe binding and was not due to cholesterol-mediated expression changes for each sensitive target, we incubated HeLa cells with or without 20  $\mu M$  cis probe and 100  $\mu M$  cholesterol for 30 min and 12 h, then collected total cellular mRNA from each treatment using the Qiagen RNEasy kit, and submitted 8  $\mu g$  total mRNA (combination of three biological replicates) per sample to the Scripps Research Institute DNA Array core facility, for quantitative transcriptomic analysis by microarray, using the HU133 Set GeneChip (Affymetrix) and the Affymetrix GeneChip Expression 3' Amplification One-Cycle protocol.

Recombinant expression and validation cholesterol competition of targets. To validate protein-cholesterol interactions identified by the trans-sterol probe for which there was no previous evidence of cholesterol binding, cDNAs encoding SQLE, FDFT1, PGRMC1, POR, ADPGK, CYP20A1 and JAGN1 were obtained (OpenBiosystems), and these proteins were recombinantly overexpressed as the full-length, unmodified proteins (except JAGN1, which was expressed with a C-terminal myc-his epitope-tag) in HeLa cells via transfection with Fugene HD according to the manufacturer's protocol. Forty-eight hours after transfection, cells were labeled in situ with either 5 µM or 10  $\mu$ M trans-sterol probe, with or without 10× (50  $\mu$ M or 100  $\mu$ M, respectively) cholesterol. Both the competed and non-competed transfected samples were compared to a control (Supplementary Fig. 6) transfected with a cDNA encoding a distinct protein, on a 10% SDS-PAGE gel, and equal expression of the protein of interest between competed and noncompeted samples was verified via western blot of the same samples on a gradient (4-20%) gel using commercial antibodies specific to each protein. Antibodies used in this study were: monoclonal mouse anti-myc (1:10,000; Invitrogen, 46-0603), polyclonal rabbit anti-POR (1:1000; Sigma-Aldrich, SAB1410996), polyclonal mouse anti-FDFT1 (1:1,000; Sigma-Aldrich, SAB1405805), monoclonal mouse anti-ADPGK (1:1,000; Sigma-Aldrich, WH0083440M1, clone 1E4), polyclonal rabbit anti-PGRMC1 (1:2,000; Sigma-Aldrich, HPA002877), polyclonal mouse anti-SQLE (1:1,000; Sigma-Aldrich, SAB1406474), monoclonal mouse anti-actin (1:2,000; Sigma-Aldrich, A3853, clone AC-40) and polyclonal rabbit anti-CYP20A1 (1:100; Thermo, PA5-14356).

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