Comparative metabolomics with Metaboseek reveals functions of

a conserved fat metabolism pathway in *C. elegans*

Maximilian J. Helf[1,#], Bennett W. Fox[1,#], Alexander B. Artyukhin[2], Ying K. Zhang[1], Frank C.

Schroeder[1,*]

[1]Boyce Thompson Institute and Department of Chemistry and Chemical Biology, Cornell

University, Ithaca, New York 14853, United States

[2]Chemistry Department, College of Environmental Science and Forestry, State University of

New York, Syracuse, New York 13210, United States

[#]These authors contributed equally to this work

*Correspondence to fs31@cornell.edu

ABSTRACT

Untargeted metabolomics via high-resolution mass spectrometry (HRMS) can reveal more than 100,000 molecular features in a single sample, many of which may represent unidentified metabolites, posing significant challenges to data analysis. We here introduce Metaboseek, an open-source analysis platform designed for untargeted comparative metabolomics and demonstrate its utility by uncovering biosynthetic functions of a conserved fat metabolism pathway, α-oxidation, using *C. elegans* as a model. Metaboseek integrates modules for molecular feature detection, statistics, molecular formula prediction, and fragmentation (MS/MS) analysis, which uncovered more than 200 previously uncharacterized α-oxidation-dependent metabolites in an untargeted comparison of wildtype and α-oxidation-defective *hacl-1* mutants. The identified metabolites support the predicted enzymatic function of HACL-1 and revealed that α-oxidation participates in metabolism of endogenous β-methyl-branched fatty acids and food-derived cyclopropane lipids. Our results showcase compound discovery and feature annotation at scale via untargeted comparative metabolomics applied to a conserved primary metabolic pathway and suggest a model for the metabolism of cyclopropane lipids.

MAIN

Widespread adoption of high-resolution mass spectrometry (HRMS) for untargeted metabolomics has revealed a vast universe of biogenic small molecules, including a large number of compounds whose chemical structures have not been elucidated ("unknowns")[1]. Many of these metabolites may serve important biological functions, as intra- or intercellular signaling molecules, e.g., as hormones, or mediating communication at the inter-organismal level, e.g., in host-microbe interactions or as pheromones[2–5]. Their large-scale identification, quantitation, and elucidation of underlying biosynthetic networks promises to advance mechanistic understanding of phenotypes and complement transcriptomics and proteomics[6–9].

However, the highly irregular and often unpredictable structures of metabolites pose a largely unmet challenge to their systematic chemical and biological annotation. High-performance liquid chromatography (HPLC)-HRMS analysis of a typical metabolome sample of plant or animal origin can reveal more than 100,000 molecular features (defined by a mass-to-charge ratio, *m/z*, and retention time, RT), representing a complex mixture of ions derived from known and unknown metabolites, adducts, naturally occurring isotopes and background[9–13]. Comparative analysis of samples representing different biological conditions or genetic

backgrounds can identify molecular features that are significantly differential between
conditions, akin to finding induced or repressed genes in transcriptomics. In the case of
untargeted metabolomics, such comparative analyses provide the basis for prioritizing among
the many detected unknowns for subsequent structure elucidation[14], which is often time- and
resource-intensive.

Processing of metabolomics data involves three major steps – feature detection,
comparative statistical analysis, and structural characterization – each of which comes with its
own challenges addressed by free, open-source computational tools as summarized in
Supplementary Table S1. Importantly, comparative metabolomics requires effective, multi-
layered interaction with MS and MS fragmentation (MS/MS) data to enable culling and
prioritization of differentially regulated molecular features, in particular when the analysis is
discovery-oriented and focused on the identification of unknowns. Exploring the metabolomes of
C. elegans and other model systems, we recognized the need for an open-source analysis
platform that can serve as a flexible and customizable hub integrating diverse existing tools.

We here introduce *Metaboseek*, a modular software platform that provides a
comprehensive data analysis workflow, from feature detection to compound identification,
specifically designed to facilitate untargeted metabolomics. Metaboseek incorporates popular
metabolomics tools and makes them available in an intuitive, browser-based graphical user
interface (**Figure 1,** also see Metaboseek.com). We then leverage Metaboseek to investigate
peroxisomal α-oxidation (pαo) in *C. elegans*, a conserved fatty acid degradation pathway that
functions in parallel with β-oxidation and is required for the breakdown of β-branched fatty acids.
Whereas β-oxidation takes place in both mitochondria and peroxisomes, α-oxidation occurs
exclusively in peroxisomes, which are membrane-bound metabolic compartments that function
coordinately with other organelles in lipid and bile acid metabolism[15]. In contrast to the well-
studied peroxisomal β-oxidation pathway[16], the pαo pathway in *C. elegans* has not been
investigated. Using Metaboseek for untargeted comparative metabolomics of a pαo mutant, we
show that disruption of *C. elegans* pαo results in accumulation of several 100 metabolites, most
of which have not previously been reported. The identified metabolites support homology-based
annotation of the pαo pathway enzyme, HACL-1, and indicate a role for pαo in the processing of
bacteria-derived cyclopropane fatty acids.

RESULTS

The Metaboseek workflow. In a typical metabolomics workflow, HPLC-HRMS and MS/MS
data acquisition is followed by *Feature Detection* (a "feature" representing a specific *m/z*, RT

pair) and *Feature Grouping* (aiming to recognize the same features across different samples, a
non-trivial step, especially in the case of closely eluting isomers). Metaboseek integrates the
XCMS package for feature detection and grouping, generating a feature table containing the
data for all identified molecular features in each sample. Alternatively, feature tables can be
imported from external tools, such as MZmine[17], MS-DIAL[18,19], or XCMSOnline[20]. Following
feature detection and grouping, any subsequent statistical or data-dependent analysis
generates new columns in the *Feature Table*, which serves as a customizable information hub
that guides data analysis.

The *Data Explorer* section is at the heart of Metaboseek, providing the platform to further
process, prioritize, sort, and visualize molecular features within the *Feature Table*. An extensive
range of filters can be used in any user-defined configuration to enable intuitive prioritization of
features, e.g., mean intensity threshold and fold change of a feature between different sample
groups, at a specific significance level. Finding molecular features with significantly differential
abundances in Metaboseek is assisted by built-in *t*-test and ANOVA, as well as group-wise fold-
change metrics. For more advanced statistical analysis, feature tables can be exported directly
in a MetaboAnalyst-compatible format[21]. Features of interest can be manually inspected in the
interactive user interface, which includes a customizable *Data Viewer* for visual validation of
molecular features, modules for *Molecular Formula Prediction* and isotope/adduct assignments,
e.g., via CAMERA[22], and removal of background-derived features via *Peak Quality* analysis
function, wherein features are scored based on fitting to an idealized peak shape. Following
validation, Metaboseek can export annotated feature tables as inclusion lists to facilitate
targeted MS/MS data acquisition. MS/MS spectra can be easily compared to each other using
the *Keep and Compare* and *Find Patterns* functions (vide infra)*,* or annotated using SIRIUS
fragmentation trees and CSI:FingerID database matching[23,24].

The *Molecular Networking* tool in Metaboseek uses feature grouping information from
XCMS to match MS/MS spectra with a corresponding molecular feature. In molecular
networking, MS/MS spectra of different features are compared and ranked by similarity of
fragmentation patterns[25,26]. Similarity scores are based on peak matching between pairs of
averaged spectra, and subsequent calculation of the cosine score between relative peak
intensities of the matched spectra, similar to the GNPS feature-based networking workflow[27].
The resulting networks, including spectra of individual features, can be easily viewed and
evaluated in Metaboseek, which allows users to click nodes and compare MS/MS fragmentation
patterns directly. Any information in the feature table, e.g., relative abundances of compounds

across sample groups, comments, or statistical analyses, can be mapped onto the network

view. Furthermore, the MS/MS networking parameters can be modified using the *Simplify*

Network function, e.g., by adjusting similarity thresholds (edges), restricting the number of

edges per node, or limiting the number of nodes per cluster (**Supplementary Figure 1**).

The Metaboseek *Data Explorer* further incorporates an isotope tracing module, *Label*

Finder, providing an integrated analysis option for stable isotope labeling experiments (**Figure**

1). Like many popular open-source data analysis tools, Metaboseek is written in R, using the

shiny R package for interactive data visualization, and thus can be run either on a server or

locally on any computer. All data analysis steps are tracked so that settings can be archived and

reproduced. Installation files and extensive documentation are available online at

Metaboseek.com.

Citronellic acid as a probe for α-oxidation. A putative *C. elegans* α-oxidation pathway was

proposed more than two decades ago, based on sequence similarity to characterized rat and

human enzymes (**Figure 2a**)[28]. In humans, the principal function of α-oxidation is presumed to

be the enzymatic digestion of β-branched fatty acids (**1**), such as (*R*)-citronellic acid (CA, **6**)

(**Figure 2d**), which cannot be processed by β-oxidation[29]. In the first step of the human α-

oxidation pathway, fatty acyl-coenzyme A (CoA) derivatives (**2**) are *syn*-hydroxylated at the α-

position by phytanoyl-CoA dioxygenase, PHYH, an iron-coordinating enzyme that is 52% and

59% identical to the uncharacterized *C. elegans* proteins, ZK550.5 and ZK550.6, respectively

(**Figure 2a**)[30]. Genetic mutations in *PHYH* cause Refsum's syndrome, which is characterized by

toxic accumulation of branched fatty acids in the blood and nervous system[31]. The next step is

catalyzed by 2-hydroxyacyl-CoA lyase, HACL1, which binds thiamine pyrophosphate (TPP) as a

cofactor and cleaves a C-C bond in the α-hydroxy, β-methylacyl-CoA (**3**) to produce formyl-CoA

and an α-methyl fatty aldehyde (**4**). The *C. elegans* gene *B0334.3*, herein referred to as *hacl-1*,

encodes an enzyme 49% identical to human HACL1, including high homology in the TPP-

binding domain (**Supplementary Figure 2**). Finally, the aldehyde (**4**) is oxidized in an NAD$^+$-

dependent reaction to the corresponding α-methyl fatty acid (**5**), which now is a suitable

substrate for further processing via β-oxidation (**Figure 2a**).

To probe p*α*o in *C. elegans*, we compared metabolism of supplemented CA (**6**) in WT

animals and *hacl-1(tm6725)* mutants (**Figure 2b**)*,* which harbor a deletion predicted to disrupt

the splice acceptor site of the largest exon (**Figure 2c**). *hacl-1(tm6725)* mutants develop

normally and exhibit no overt abnormalities under laboratory conditions. If *hacl-1* were required

for α-oxidation, supplementation with CA should result in accumulation of an α-hydroxyl CA

derivative (**7**), whose MS/MS spectrum should show a characteristic neutral loss of formic acid (**Figure 2d**)[32]. The custom filtering options and extracted ion chromatogram (EIC) display in Metaboseek facilitated screening molecular ions at the expected *m/z* of **7** (*m/z* 185.1183, $C_{10}H_{17}O_3^-$) that produce neutral loss of formic acid during MS/MS and were strongly enriched in *hacl-1* samples (**Figure 2e**). Of six other CA-derived features detected at *m/z* 185.1183, none were enriched in *hacl-1* relative to WT, nor did these features exhibit neutral loss of formic acid in MS/MS, suggesting these features are derived from hydroxylation of CA via other metabolic pathways (**Supplementary Figure 3**).

Additional CA-dependent features enriched in *hacl-1* relative to CA-supplemented WT animals were uncovered using a combination of fold change, intensity, and CA-supplementation dependent filters, which, after removal of adducts, revealed 32 CA-derived metabolites (**Supplementary Figure 3**). These differential features included multiply oxygenated CA derivatives, which could be ostensibly derived from ω-oxidation following stalled α-oxidation[33]. For example, we detected several features at *m/z* 201.1132 that elute over a wide RT range, representing dihydroxylated CA derivatives, two of which were *hacl-1*-enriched (such as **8**, see also **Supplementary Figure 3**). Additional *hacl-1*-dependent CA-derivatives included putative ethanolamides (**9**), glycosides (**10**), and an *N*-acyl glycerophosphoethanolamide conjugate (**Supplementary Figure 3**). For most of these compounds, MS/MS fragmentation between the α- and carbonyl carbons suggested α-hydroxylation of the citronellyl moiety (**Figure 2d**). Similar results were obtained when *hacl-1* worms were supplemented with geranic or phytanic acid (data not shown). Taken together, this supplementation study revealed a set of *hacl-1*-dependent shunt metabolites of CA, consistent with the proposed function of HACL-1 as a 2-hydroxyacyl-CoA lyase.

Endogenous C_{11} fatty acids enriched in *hacl-1* larvae. We next investigated the impact of *hacl-1* inactivation on endogenous metabolites, using molecular networking of MS/MS spectra acquired as part of in-depth untargeted HPLC-HRMS analysis of *hacl-1* mutants and WT *C. elegans*. To assess the role of *hacl-1* in *C. elegans* metabolism, we initially focused on starved animals at the first larval stage (L1), a condition that allows the study of *C. elegans* metabolism in the absence of bacterial food[34]. Comparative analysis of negative ion MS data for L1 larvae revealed a small set of features strongly enriched in *hacl-1* relative to WT, several of which clustered together in the MS/MS network (**Figure 3a**). Stringent fold change (10-fold), intensity (top 1.25% of detected features), and unadjusted significance (p < 0.05) thresholds yielded 57 molecular features that were highly enriched in *hacl-1* larvae. Following *CAMERA*

isotope/adduct assignment and manual curation, we detected 14 *hacl-1*-dependent metabolites

(**Figure 3b**). Intriguingly, the majority of these compounds appeared to represent C_{11} fatty acids,

based on their ionization properties and MS/MS spectra. Furthermore, MS/MS spectra of the

most abundant *hacl-1*-enriched metabolites featured a product ion with *m/z* 72.993

corresponding to glyoxylate ($C_2HO_3^-$), which was not observed in any CA-derived metabolites

(**Figure 3c**).

We selected one highly abundant *hacl-1*-enriched metabolite ($C_{11}H_{19}O_4^-$) for isolation by

preparative HPLC followed by structure elucidation via 2D NMR spectroscopy (**Supplementary**

Figure 4 and **Supplementary Table S2**), which revealed an unusual β-methyl substituted,

eleven-carbon fatty acid, named bemeth#3 (**11**, **Figure 3c**). α-Hydroxylation and the position of

the double bond in bemeth#3 are consistent with the strong glyoxylate product ion in its MS/MS

spectrum. Moreover, the structure of bemeth#3 suggested that other glyoxylate ion-producing

metabolites that accumulate in *hacl-1* mutants also represent derivatives of α-hydroxylated β-

methyl-4-decenoic acid (e.g., **12**, **Figure 3c**). These assignments were further supported via

synthesis of an authentic sample of the two diastereomers of **12** (**Figure 3d** and

Supplementary Table S3), whose MS/MS spectra and retention times were identical to those

of the corresponding *hacl-1*-enriched metabolites (**Figure 3e**). Other metabolites enriched in

hacl-1 include less abundant isomers of **11** and **12** with identical MS/MS fragmentation, as well

as derivatives that appear to have undergone additional oxidation, including putative

dicarboxylic acids, such as $C_{11}H_{17}O_5^-$ (**Supplementary Figure 5**). Taken together, analysis of

hacl-1 larvae revealed an unusual family of C_{11} fatty acids based on the β-methyl-decenoic acid

scaffold, which has not been previously reported from animals. The presence of an α-hydroxyl

group in the identified C_{11} acids **11** and **12** suggests that they represent plausible substrates of

HACL-1 and therefore accumulate in *hacl-1* mutants. The more highly oxygenated derivatives,

such as $C_{11}H_{17}O_5^-$, could result from ω-oxidation of **12** as part of a shunt pathway, similar to the

role of ω-oxidation in human fatty acid metabolism[33].

Comparative metabolomics of *hacl-1* adults. Next, we employed Metaboseek for

comparative metabolomics of adult-stage *hacl-1* mutant and WT animals. Conditioned culture

medium (*exo*-metabolome) and worm bodies (*endo*-metabolome) were harvested separately,

extracted, and analyzed by HPLC-HRMS/MS in positive and negative ionization modes, yielding

more than 100,000 features combined following blank subtraction and *Peak Quality* thresholding

(see Methods). Like *hacl-1* mutant larvae, *hacl-1* adults accumulate the β-branched C_{11} acid **11**

and related metabolites (**Supplementary Figure 6**). However, in contrast to L1 larvae, these

C_{11} acid derivatives were not the most differential metabolites in *hacl-1* adults (**Supplementary**

Figure 6). Untargeted analysis using intensity (top 6.5% of detected features), unadjusted

significance ($p < 0.05$), and fold-change (5-fold) filters uncovered >1,000 features that were

enriched in the *hacl-1 exo*-metabolome, which we explored by MS/MS networking.

The majority of differential features clustered in five major subnetworks (SN1-SN5,

Figure 4). Inspection of SN1 revealed several homologous series of features, related by the

mass difference of a methylene ($\Delta m/z$ 14.0156). Use of the "*Keep and Compare*" functionality in

the *MS/MS Browser* facilitated simultaneous display of multiple MS/MS spectra and

automatically highlights fragments shared between spectra, e.g., conserved product ions that

correspond to a phosphoethanolamine moiety, a phosphorylated hexose, and ions indicating a

phosphate group (**Supplementary Figure 7**). Complementary analysis of MS/MS fragmentation

patterns in positive ionization mode further supported that SN1 represents *N*-acyl

glycophosphoethanolamides ("*N*-acyl GPEs"), including saturated (N:0), singly unsaturated

(N:1), polyunsaturated (N:n), and mono-oxygenated (mN:n) acyl moieties ranging from C_8-C_{20}.

In many cases, several isobaric features were detected, e.g., four distinct isomers of *N*-acyl

GPE-14:2 (**Supplementary Figure 8**). Enrichment trends were similar across the *endo*- and the

exo-metabolomes, but *N*-acyl GPE were 10-100-fold more abundant in the *exo*-metabolome

(**Supplementary Figure 8**).

Finding MS/MS patterns with Metaboseek. Analysis of SN2 indicated that it represents *N*-acyl

glycoglycerophosphoethanolamides ("GLEA", **Figure 4**). This compound family had been

previously described in the context of ethanol-dependent *de novo* fatty acid biosynthesis in

starved *C. elegans* larvae[35]. MS/MS spectra of GLEA exhibit a characteristic product ion at *m/z*

333.0592, in addition to phosphoglycerol and several glucose-derived fragments, which were

used to define a "*Pattern*" in Metaboseek. The *Find Patterns* function in Metaboseek profiles all

MS/MS spectra for user-defined fragmentation patterns, including neutral losses; hits are

matched and recorded in new interactive columns in the feature table, which enabled rapid

identification of more than 100 GLEA-like molecular features distributed across SN2 and two

additional subnetworks, SN3 and SN4 (**Figure 4**).

Each of the three GLEA clusters revealed slightly different MS/MS fragmentation,

providing important structural clues. GLEA in SN3 produced additional product ions with *m/z*

376.1016 and 418.1123, suggesting that these metabolites are β-hydroxylated, which then

results in fragmentation between the α and β carbons (**Figure 4**). Larger cultures of *hacl-1* were

grown and extracted to isolate the most abundant compound from SN3, GLEA-m16:1, one of

the most intense and differential features in the entire *exo*-metabolome. 2D NMR spectroscopic
analysis established this compound as a 2-*O*-(β-glucosyl)-glycero-1-phosphoethanolamide of β-
hydroxylated hexadecenoic acid (**16**, **Supplementary Table S4**). β-hydroxylation of the fatty
acyl moiety in this compound is consistent with observed fragmentation between the α and β
carbons of the fatty acyl group and suggests that other metabolites in SN3 also represent GLEA
of β-hydroxylated fatty acids (**Figure 4**). Upregulation of β-hydroxylated lipid derivatives
suggested that mitochondrial or peroxisomal β-oxidation may be perturbed in *hacl-1* mutants.
However, production of ascaroside pheromones, which relies on peroxisomal β-oxidation, was
largely unchanged in *hacl-1* mutants compared to WT (**Supplementary Figure 9**), suggesting
that *hacl-1* inactivation may interact with mitochondrial β-oxidation.

GLEA in SN4 did not undergo fragmentation across the α and β carbons, but instead
produced an intense product ion with *m/z* 376.1016, corresponding to fragmentation across the
amide bond. GLEA in SN4 were much less abundant and eluted later than isobaric metabolites
in SN3. We hypothesize that SN4 represents GLEA bearing α-hydroxy acyl substituents;
however, their low abundance precluded NMR spectroscopic characterization (**Supplementary
Figure 10**). Lastly, analysis of SN5 revealed a large family of *hacl-1*-enriched *N*-acyl
ethanolamides (NAEs) (**Figure 4**). All NAE in SN5 produced the product ion with *m/z* 102.056,
corresponding to cleavage between the α- and β-carbon of the acyl group, suggesting β-
hydroxylation in analogy to SN3.

Stable isotope tracing with Metaboseek. Comparing the series of *N*-acyl-GPEs, GLEA, and
NAEs enriched in *hacl-1* worms, we noted that derivatives of mono-unsaturated C_{13}- and C_{15}-
fatty acids were among the most abundant *hacl-1*-enriched compounds, even though the
corresponding free fatty acids are not particularly abundant in *C. elegans*[36]. Generally, odd-
chain fatty acids in *C. elegans* are derived primarily either from iso-branched chain fatty acid
(BCFA) biosynthesis, which employs leucine-derived isovaleryl-CoA as a starter unit[37], or,
alternatively, from metabolism of diet-derived cyclopropane fatty acids, which are abundantly
produced by the bacterial diet, *E. coli* OP50[38].

We first tested whether the major *hacl-1*-enriched monounsaturated C_{13} and C_{15} lipids
are derived from BCFA metabolism. For this purpose, we grew worms supplemented with $^{13}C_6$-
labeled leucine, which we reasoned should result in $^{13}C_5$-enrichment of BCFAs and any derived
N-acyl GPE, GLEA, and NAE (**Figure 5a**). The *Label Finder* tool in Metaboseek facilitated
profiling $^{13}C_5$- and $^{13}C_6$-enrichment for discovery of BCFA- and Leu-derived metabolites. This
analysis revealed several hundred isotope-enriched features, including iso-branched fatty acids

and derivatives thereof, which were visually validated using the *Mass Shifts* feature in

Metaboseek to display EICs corresponding to incorporation of $^{13}C_5$ (Δ *m/z*, 5.0167, **Figure 5b**).

However, the most abundant *hacl-1*-enriched compounds harboring 13:1 and 15:1 acyl groups

showed no evidence for label incorporation, indicating that these unsaturated odd chain lipids

do not originate from BCFA metabolism (**Supplementary Figure 11**).

Cyclopropane fatty acids accumulate in *hacl-1*. We then asked whether the

monounsaturated C_{13} and C_{15} fatty acyl derivatives accumulating in *hacl-1* mutants are derived

from bacterial cyclopropane fatty acids. In the case of *E. coli* OP50, C_{17} and C_{19} cyclopropane

lipids can account for nearly half of all lipid species and thus comprise a substantial portion of *C.*

elegans lipid intake[39]. To test whether the monounsaturated C_{13} and C_{15} lipids enriched in *hacl-1*

are derived from cyclopropane fatty acids, we compared the metabolomes of worms fed either

OP50 or JW1653-1 bacteria, a cyclopropane-deficient *E. coli* strain[40] (**Figure 5c**). First, we

confirmed via 2D NMR spectroscopy that JW1653-1 does not produce cyclopropane lipids and

that worms fed JW1653-1 bacteria do not produce cyclopropane lipids (**Supplementary Figure**

12). Next, we compared the metabolomes of animals grown on OP50 or JW1653-1 via HPLC-

HRMS, which revealed that production of the most abundant *hacl-1*-enriched *N*-acyl GPEs was

abolished in JW1653-1-fed worms (**Figure 5d**). Additional *N*-acyl GPEs enriched in *hacl-1*

mutant were also found to be dependent on bacterial cyclopropane fatty acid biosynthesis,

including multiple hydroxylated *N*-acyl GPE species (**Figure 5e**). Untargeted comparative

analysis of OP50- and JW1653-1-fed worms revealed a large number of other cyclopropane-

containing metabolites, including GLEA, as well as putative oxidized fatty acids and fatty acyl

glycosides, many of which also accumulate in *hacl-1* worms (**Figure 5f** and **Supplementary**

Figure 13). Taken together, our results suggest that diet-derived C_{17} or C_{19} cyclopropane fatty

acids are initially chain shortened via β-oxidation to yield shorter chained derivatives that

become substrates for pαo. If pαo is blocked, as in the case of *hacl-1* inactivation, β-oxidation

intermediates are shunted towards production of, e.g., *N*-acyl GPE, GLEA, and other lipids

(**Figure 5g**).

DISCUSSION

We here demonstrated the use of Metaboseek for a multi-layered comparative metabolomics

study of a conserved fatty acid metabolism pathway, pαo, in *C. elegans*. By probing metabolism

of WT and *hacl-1* mutants with a pαo test substrate, CA, we confirmed the predicted enzymatic

function of HACL-1 as a 2-hydroxyacyl-CoA lyase. Subsequent untargeted comparison revealed

pervasive changes in lipid metabolism in *hacl-1* mutants, including accumulation of an unusual
family of α-hydroxylated β-branched C_{11} acids. Their abundant production and life stage-specific
regulation suggests that β-branched C_{11} acids – perhaps a precursor or downstream metabolite
of **11** and **12** – may serve specific functions in *C. elegans*. In addition to the C_{11} acids, *hacl-1*
mutants accumulate an unexpected diversity of modular lipids derived from the intersection of
multiple branches of fatty acid metabolism with NAE biosynthesis. Particularly abundant among
lipids accumulating in *hacl-1* are derivatives of cyclopropyl fatty acids, suggesting that pαo
participates in cyclopropyl metabolism. Mechanisms for the breakdown of cyclopropyl fatty acids
have remained largely unknown, though cyclopropyl lipids have previously been shown to affect
recovery from larval diapause (dauer)[41]. Cyclopropyl lipids are also present in the human diet,
most prominently in cheese and dairy originating from animals fed fermented grains; however,
whether α-oxidation plays a role in the mammalian metabolism of cyclopropyl lipids remains to
be determined[42,43].

Comparative analysis with Metaboseek revealed a large number of additional
differences between the metabolomes of WT and *hacl-1* animals, of which many represent
previously undescribed metabolites (**Supplementary Table S5**). For all newly annotated
metabolites, this table includes retention time, *m/z*, putative molecular formulae and compound
class assignments, fold-change, as well as isotopic enrichment data, which will facilitate follow-
up studies in conjunction with the deposited MS raw data[44–46]. As we here demonstrated, in-
depth evaluation of MS and MS/MS raw data is key to discovery-oriented workflows. Online
resources such as GNPS and MassBank provide access to vast amounts of MS data,
highlighting the need for versatile tools that facilitate raw data analysis for metabolomics[47–49].
For this purpose, Metaboseek combines more than 60 different modules which tool developers
can use as building blocks for specialized data analysis apps with minimal effort. The seamless
integration of intuitive data filters and a range of analysis tools facilitates metabolite annotation
up to confidence Level 3 for many detected features, enabling tentative structure or compound
class assignments[50–52]. In parallel, facile statistical analysis of metabolite variation across
multiple genotypes and/or environmental conditions enables developing functional and
biosynthetic hypotheses. Further, the output from Metaboseek facilitates intersecting
metabolomics with transcriptomics, proteomics, or genomics, toward a systems-level
understanding of biosynthetic networks and metabolite functions. Metaboseek thus provides a
flexible and expandable open-source platform to accelerate chemical and biological annotation
of metabolites, including the large space of yet unidentified biogenic small molecules.

Our comparative metabolomics analysis of α-oxidation shows that even a primary

metabolic pathway in an otherwise well-studied model system can reveal a large number of

previously uncharacterized compounds, as well as unexpected connections to other pathways,

e.g., β-oxidation or cyclopropane fatty acid metabolism. Like much of conserved primary

metabolism, α-oxidation was initially characterized more than 50 years ago[53,54]. It seems likely

that re-analysis of primary metabolic pathways using state-of-the-art HRMS and data analysis

tools will synergize with transcriptomic and proteomic studies to harness the potential of

metabolomics as the 'omics discipline that most closely reflects phenotype[7–9].

METHODS

C. elegans strains. Unless otherwise indicated, worms were maintained on Nematode Growth Medium (NGM) 6 cm diameter petri dish plates seeded with _E. coli_ OP50 obtained from the _Caenorhabditis_ Genetics Center (CGC). For experiments with cyclopropane deficient bacteria, worms were grown on NGM 6cm plates seeded with _E. coli_ JW1653-1, a kind gift from the Walhout Lab (University of Massachusetts Medical School, Worcester, MA). The following _C. elegans_ strains were used for comparative metabolomics: Bristol N2 ("wildtype") obtained from the CGC, and _B0334.3(tm6725)_ obtained from the National Bioresource Project, Tokyo, Japan[55], referred to as _hacl-1,_ strain designation FCS7. The FCS7 strain was the result of backcrossing _tm6725_ with _sqt-1 (_FCS6) for seven generations. FCS6 was iteratively backcrossed with Bristol N2 for a total of six generations. After the final backcross, FCS7 hermaphrodites were singled and allowed to self, non-rollers were picked, and the genotype was confirmed by PCR and Sanger sequencing.

C. elegans liquid cultures. Analysis of starved L1 larvae followed a previously described procedure[56]. For the analysis of staged gravid adults, approximately 75,000 synchronized L1 larvae were added to 125 mL Erlenmeyer flasks containing 25 mL S-complete medium and kanamycin at 35 µg/mL to prevent contamination. Worms were fed with 50x concentrated _E. coli_ OP50 or _E. coli_ JW1653-1 and incubated at 20 °C with shaking at 180 RPM for 66–70 h, at which time the population was predominantly gravid adults, determined by microscopic inspection. Control samples to account for bacterial matrix were prepared with the same amount of _E. coli_ OP50 or JW1653-1 under identical conditions. Liquid cultures were transferred to 50 mL conical tubes and centrifuged (500 x g, 22 °C, 1 min), and the top 20 mL of the resulting supernatant (_exo_-metabolome) was transferred to a fresh conical tube and snap frozen. Remaining worm pellet was transferred to a 15 mL conical tube, centrifuged (500 x g, 22 °C, 1 minute), and washed three times with M9 before snap freezing in liquid nitrogen.

Test substrate feeding experiments. Approximately 100,000 synchronized L1 larvae were added to 125 mL Erlenmeyer flasks containing 10 mL M9 media and 300 µM citronellic acid (Sigma-Aldrich 303429), phytanic acid (Sigma-Aldrich P4060), retinoic acid (Sigma-Aldrich R2625), geranic acid (Aldrich 427764), or an equivalent volume of methanol only (vehicle control) and were incubated at 20 °C with shaking at 180 RPM for 24 hrs. Cultures were transferred to 15 mL conical tubes and centrifuged (500 x g, 22 °C, 1 min), and the resulting supernatant (_exo_-metabolome) was transferred to a fresh conical tube and snap frozen. Remaining L1 pellet was washed three times with M9 before snap freezing in liquid nitrogen.

^{13}C$_6$-Leu isotope tracing experiment. Approximately 60,000 synchronized N2 (WT) L1 larvae were added to 125 mL Erlenmeyer flasks containing 20 mL S-Complete medium. Worms were fed with 60 mg freeze-dried OP50 powder (InVivoBiosystems, formerly NemaMetrix Inc., OP-50-31772) and supplemented with leucine (Sigma Aldrich L8000) or ^{13}C$_6$-leucine (Cambridge Isotope Laboratories CLM-2262-H-PK) at a final concentration of 2 mM. Worms were incubated at 20 °C with shaking at 180 RPM for 66–70 hrs, at which time the population was a mixture of young and gravid adults, determined by microscopic inspection. Liquid cultures were centrifuged (500 x g, 22 °C, 1 min), and the resulting supernatant was snap frozen. Worm pellet was washed three times with M9 before snap freezing in liquid nitrogen.

Sample preparation for HPLC-MS. *Exo*-metabolome (conditioned media) samples were lyophilized ~48 hrs using a VirTis BenchTop 4K Freeze Dryer. Dried material was directly extracted in 10 mL methanol in 20 mL glass vials stirred overnight. Vials were centrifuged at 2750 RCF for five minutes in an Eppendorf 5702 Centrifuge using rotor F-35-30-17. The resulting supernatant was transferred to a clean 20 mL glass vial and concentrated to dryness in an SC250EXP Speedvac Concentrator coupled to an RVT5105 Refrigerated Vapor Trap (Thermo Scientific). The resulting powder was suspended in methanol and analyzed directly by HPLC-MS, as described below. *Endo*-metabolome (nematode bodies) were lyophilized for 18-24 hrs using a VirTis BenchTop 4K Freeze Dryer. Dried pellets were transferred to 1.5 mL microfuge tubes and disrupted in a Spex 1600 MiniG tissue grinder after the addition of two stainless steel grinding balls to each sample. Microfuge tubes were placed in a Cryoblock (Model 1660) cooled in liquid nitrogen, and samples were disrupted at 1100 RPM for 60 s. This process was repeated two additional rounds for a total of three disruptions. Pellets were transferred to 8 mL glass vials in 5 mL methanol and stirred overnight. Subsequent steps for concentration and resuspension were followed as described for the *exo*-metablome.

Mass spectrometry. Liquid chromatography was performed on a Vanquish HPLC system controlled by Chromeleon Software (ThermoFisher Scientific) and coupled to an Orbitrap Q-Exactive High Field mass spectrometer controlled by Xcalibur software (ThermoFisher Scientific). Methanolic extracts prepared as described above were separated on a Thermo Hypersil Gold C18 column (150 mm x 2.1 mm, particle size 1.9 µM; 25002-152130) maintained at 40 °C with a flow rate of 0.5 mL/min. Solvent A: 0.1% formic acid (Fisher Chemical Optima LC/MS grade; A11750) in water (Fisher Chemical Optima LC/MS grade; W6-4); solvent B: 0.1% formic acid in acetonitrile (Fisher Chemical Optima LC/MS grade; A955-4). A/B gradient started at 1% B for 3 min after injection and increased linearly to 98% B at 20 min, followed by 5 min at

98% B, then back to 1% B over .1 min and finally held at 1% B for the remaining 2.9 min to re-
equilibrate the column (28 min total method time). Mass spectrometer parameters: spray
voltage, -3.0 kV / +3.5 kV; capillary temperature 380 °C; probe heater temperature 400 °C;
sheath, auxiliary, and sweep gas, 60, 20, and 2 AU, respectively; S-Lens RF level, 50;
resolution, 120,000 at *m/z* 200; AGC target, 3E6. Each sample was analyzed in negative (ESI-)
and positive (ESI+) electrospray ionization modes with *m/z* range 100-1000. Parameters for
MS/MS (dd-MS2): MS1 resolution, 60,000; AGC Target, 1E6. MS2 resolution, 30,000; AGC
Target, 2E5. Maximum injection time, 60 msec; Isolation window, 1.0 *m/z*; stepped normalized
collision energy (NCE) 10, 30; dynamic exclusion, 5 sec; top 8 masses selected for MS/MS per
scan. Inclusion lists with 20 sec windows were generated in Metaboseek for targeted MS/MS.

Metaboseek analysis. HPLC-MS data were analyzed using Metaboseek software
(documentation available at Metaboseek.com) after conversion to mzXML file format using
MSConvert (version 3.0, ProteoWizard[57]); for a full list of supported file types, see section 3.3.4
Supported File Types. A subset of the mzXML files used in this study are provided as an
example data set included with the Metaboseek download at Metaboseek.com. The authors
recommend installing and running the software locally. For large datasets, 32 GB memory and
modern processor (Intel core i7 7700 / Ryzen 7 1700 or better) is recommended. For analysis
with up to 50 files (28-minute method), 16 GB of memory are usually enough. Following
conversion to mzXML, data were analyzed using the XCMS-module within Metaboseek with
default settings, as described in section 3.5 *XCMS Analysis*. Peak detection was carried out
with the *centWave* algorithm using the "Metaboseek_default" settings: 4 ppm, 3_20 peakwidth,
3 snthresh, 3_100 prefilter, FALSE fitgauss, 1 integrate, TRUE firstBaselineCheck, 0 noise,
wMean mzCenterFun, −0.005 mzdiff. Default settings for XCMS feature grouping: 0.2 minfrac, 2
bw, 0.002 mzwid, 500 max, 1 minsamp, FALSE usegroups. Metaboseek peak filling used the
following settings: 3 ppm_m, 3 rtw, TRUE rtrange, FALSE areaMode. The XCMS-generated
feature table was loaded into the Metaboseek *Data Explorer* along with relevant MS files by
designating a project folder, see section 3.3.2 *Load a Metaboseek Project Folder*. MS data
display and MS data table were grouped according to genotype and experimental condition via
Regroup MS data (section 3.4.2) and *Regroup Table* (section 3.4.4.4), respectively. After
defining groups as i) *C. elegans* samples, ii) bacterial matrix samples, or iii) blanks, blank
subtraction was performed such that any feature less than ten-fold more abundant in *C. elegans*
samples than in blanks was removed. The resulting feature list was further culled using the *Fast*
Peak Shapes (Peak Quality) analysis (**Supplementary Table S6**). These settings were selected

for discovery-oriented comparative metabolomics, aiming to retain as many likely "real" features as possible. The resulting table was then regrouped according to *C. elegans* genotype (see *Regroup Table*, section 3.4.4.4) and *Basic Analysis* was performed with WT as the "control" group; see section 3.4.4.3 *Analyze Table* for a complete list of analysis and normalization options. Following analysis, relevant MS/MS data were loaded as described in section 3.3.1 *Load MS Data Files Directly*, followed by matching of MS/MS scans to the MS1 files as described in section 3.4.4.3.3 *Advanced Analysis* under the subheading *Find MS2 scans*. At this point, the table was culled to include only MS/MS-matched features, then culled further using a retention time filter, as described in section 3.4.4 *Feature Table Actions*. MS/MS networking was performed as described in section 3.4.2.2 *Compare MS2,* see also **Supplementary Figure 1** for an example of the *Simplify Network* modifications and display options. All plots and reports, including SIRIUS fragmentation trees, can be exported as vector graphics for rapid and efficient sharing, outlined in section 3.4.2.2 *Feature Report*. HRMS data were analyzed using "Metaboseek_default" settings and normalized to the abundance of ascr#3. The identities of all quantified metabolites were verified by analysis of MS/MS spectra and/or synthetic standards.

Isolation and NMR spectroscopy of bemeth#3 (11) and GLEA-m16:1 (16). For isolation of GLEA-m16:1 (**16**) from adult *exo*-metabolome, conditioned media from several medium scale *C. elegans hacl-1* cultures was lyophilized and extracted with methanol (as described). Dried methanol extract was loaded onto Celite and fractionated using medium pressure reverse phase chromatography (15 g C18 Combiflash RediSep column, Teledyne Isco 69-2203-334). Solvent A: 0.1% acetic acid in water; solvent B: acetonitrile. Column was primed with 1% B; separation was achieved by 5% B for 2 column volumes (CV), which was increased linearly to 50% B over 15 CV, then to 100% B over 3 CV and held at 100% B for 5 CV, before returning to 80% B for 3 CV. Fractions were assayed for compounds of interest by HPLC-MS, the relevant fractions were combined and dried *in vacuo*. Following suspension in water: methanol (1:2), the pooled fractions were further separated by semi-preparative HPLC on a Thermo Hypersil Gold C18 column (250 mm x 10 mm, particle size 5 µM; 25005-259070) using a Vanquish UPLC system controlled by Chromeleon Software (ThermoFisher Scientific) and coupled to a Dionex UltiMate 3000 Automated fraction collector and to an Orbitrap Q-Exactive High Field mass spectrometer using a 9:1 split. Fractions containing GLEA-m16:1 were combined and analyzed by 2D NMR spectroscopy (CD$_3$OD, Bruker AVANCE III HD, 800 MHz). For spectroscopic data, see **Supplementary Table S4**. For isolation of bemeth#3, conditioned media from several starved L1 cultures was extracted and fractionated analogously. For spectroscopic data, see

Supplementary Table S2, and relevant section of the dqfCOSY spectrum are shown in
Supplementary Figure 4.

Chemical syntheses

General synthetic procedures. All oxygen and moisture-sensitive reactions were carried out
under argon atmosphere in flame-dried glassware. Solutions and solvents sensitive to moisture
and oxygen were transferred via standard syringe and cannula techniques. All commercial
reagents were purchased as reagent grade and, unless otherwise stated, were purchased from
Sigma-Aldrich and used without any further purification. Acetic acid (AcOH), acetonitrile (ACN),
dichloromethane (DCM), ethyl acetate (EtOAc), formic acid, hexanes and methanol (MeOH)
used for chromatography and as a reagent or solvent were purchased from Fisher Scientific.
Thin-layer chromatography (TLC) was performed using J. T. Baker Silica Gel IB2F plates. Flash
chromatography was performed using Teledyne Isco CombiFlash systems and Teledyne Isco
RediSep Rf silica and C18 columns. All deuterated solvents were purchased from Cambridge
Isotopes. Nuclear Magnetic Resonance (NMR) spectra were recorded on Bruker INOVA 500
(500 MHz) and Varian INOVA 600 (600 MHz) spectrometers at Cornell University's NMR facility
and Bruker AVANCE III HD 800 MHz (800 MHz) or Bruker AVANCE III HD 600 MHz (600 MHz)
at SUNY ESF's NMR facility. ^{1}H NMR chemical shifts are reported in ppm (δ) relative to residual
solvent peaks (7.26 ppm for chloroform-d, 3.31 ppm for methanol-d_4). NMR-spectroscopic data
are reported as follows: chemical shift, multiplicity (s = singlet, d = doublet, t = triplet, q =
quartet, m = multiplet, br = broad), coupling constants (Hz). ^{13}C NMR chemical shifts are
reported in ppm (δ) relative to residual solvent peaks (77.16 ppm for chloroform-d, 49.00 ppm
for   methanol-d_4).   All   NMR   data   processing   was   done   using   MNOVA   14.2.1
(https://mestrelab.com/).

Preparation of [Cu(*S,S*)-*tert*-butylbis(oxazolinyl)](SbF$_6$)$_2$

[Cu(S,S)-tert-butylbis(oxazolinyl)](SbF$_6$)$_2$

To a solution of (*S,S*)-2,2′-isopropylidene-bis(4-tert-butyl-2-oxazoline) (200 mg, 0.68 mmol) in
dry dichloromethane (8 mL), CuCl$_2$·H$_2$O (139 mg, 0.82 mmol) and AgSbF$_6$ (583 mg, 0.7 mmol)

were added, and the resulting mixture was stirred at room temperature for 14 hours. The green

solution was filtered through cotton for later use.

Ethyl 2-hydroxy-3-methylpent-4-enoate (14)

cis-butene was bubbled through a solution of ethyl glyoxylate (2 mL, 9.82 mmol) and [Cu(*S,S*)-

tert-butylbis(oxazolinyl)](SbF$_6$)$_2$ at -78 °C in dry dichloromethane (2 mL), and the reaction was

sealed to react at 40 °C. After 2 days, the reaction was concentrated *in vacuo*. Flash column

chromatography on silica using a gradient of 0-30% ethyl acetate in hexane afforded **14** as a

clear oil (977 mg, 63%, mixture of diastereomers).

Major diastereomer, ^{1}H NMR (600 MHz, chloroform-*d*): δ (ppm) 5.74 (ddd, *J* = 17.8, 9.8, 8.1 Hz,

1H), 5.07 (m, 1H), 5.05 (m, 1H), 4.24 (m, 2H), 4.10 (dd, *J* = 6.2, 3.4 Hz, 1H), 2.72 (d, *J* = 6.2 Hz,

1H), 2.69-2.61 (m, 1H), 1.29 (t, *J* = 7.2 Hz, 3H), 1.16 (d, *J* = 7.0 Hz, 3H).

Minor diastereomer, ^{1}H NMR (600 MHz, chloroform-*d*): δ (ppm) 5.85 (ddd, *J* = 17.4, 10.3, 7.4

Hz, 1H), 5.12 (m, 1H), 5.09 (m, 1H), 4.26 (m, 2H), 4.16 (dd, *J* = 6.3, 3.7 Hz, 1H), 2.76 (d, *J* = 6.3

Hz, 1H), 2.69-2.61 (m, 1H), 1.29 (t, *J* = 7.2 Hz, 3H), 1.01 (d, *J* = 7.0 Hz, 3H).

Ethyl (*E*)-2-hydroxy-3-methyldec-4-enoate (15)

To a solution of **14** (950 mg, 6.00 mmol) dissolved in dry dichloromethane (20 mL), Grubbs

catalyst 2nd generation (94 mg, 0.15 mmol) and 1-heptene (2.52 mL, 18.00 mmol) were added

at room temperature. The reaction mixture was allowed to stir 20 h and was concentrated *in*

vacuo. Flash column chromatography on silica using a gradient of 0-30 % ethyl acetate in

hexanes afforded **15** as a clear oil (785 mg, 76% BRSM, mixture of diastereomers).

Major diastereomer, ^{1}H NMR (600 MHz, chloroform-*d*): δ (ppm) 5.46 (dt, *J* = 15.4, 6.7 Hz, 1H),

5.31 (dd, *J* = 15.4, 8.2 Hz, 1H), 4.27-4.18 (m, 2H), 4.06 (m, 1H), 2.67 (d, *J* = 5.2 Hz, 1H), 2.60

(m, 1H), 1.96 (q, J = 7.3 Hz, 2H), 1.36-1.20 (m, 6H), 1.29 (t, J = 7.3 Hz, 3H), 1.13 (d, J = 7.1 Hz,

3H), 0.87 (t, J = 7.2 Hz, 3H).

Minor diastereomer, ^{1}H NMR (600 MHz, chloroform-d): δ (ppm) 5.52 (dt, J = 15.4, 6.5 Hz, 1H),

5.40 (dd, J = 15.4, 7.8 Hz, 1H), 4.27-4.18 (m, 2H), 4.09 (m, 1H), 2.70 (d, J = 6.8 Hz, 1H), 2.56

(m, 1H), 2.00 (q, J = 7.2 Hz, 2H), 1.36-1.20 (m, 6H), 1.28 (t, J = 7.2 Hz, 3H), 1.12 (d, J = 7.0 Hz,

3H), 0.87 (t, J = 7.1 Hz, 3H).

(*E*)-2-hydroxy-3-methyldec-4-enoic acid (bemeth#2, 12)

To a solution of **15** (76 mg, 0.33 mmol) in 1,4-dioxane (2 mL), lithium hydroxide monohydrate

(42 mg, 1.00 mmol) in H_2O (1 mL) was added, and the resulting mixture was stirred at 60 °C for

12 hours. Glacial acetic acid (0.5 mL) was added, and the reaction was concentrated *in vacuo*.

Flash column chromatography on silica using a gradient of 0-50% ethyl acetate in hexanes

afforded **12** (46.7 mg, 70%) as a clear oil.

For ^{1}H and ^{13}C NMR spectroscopic data of the major diastereomer of bemeth#2 **(12)**, see

Supplementary Table S3.

Minor diastereomer, ^{1}H NMR (600 MHz, methanol-d_4): δ (ppm) δ (ppm) 5.56-5.41 (m, 2H), 3.96

(d, J = 4.6 Hz, 1H), 2.54 (m, 1H), 2.00 (m, 2H), 1.43-1.25 (m, 6H), 1.00 (d, J = 6.9 Hz, 3H), 0.90

(t, J = 7.0 Hz, 3H).

Data availability. All data analyzed during this study are included in the manuscript and
supporting files. MS/MS data is available via MassIVE under accession number:
MSV000087885. Helf MJ, Fox BW, Artyukhin AB, Zhang YK, Schroeder FC (2021) MassIVE ID
MSV000087885. Comparative metabolomics with Metaboseek reveals functions of peroxisomal
α-oxidation in *C. elegans* [https://doi:10.25345/C5P24X]. Source data are provided with this
paper.

Code availability. Metaboseek is available as an R package, with installation instructions for
Windows, macOS, and Linux. A preconfigured R-portable installation is available as installer or
.zip file for Windows. All source code and downloads are available at
https://github.com/mjhelf/Metaboseek or https://doi.org/10.5281/zenodo.3360087. Code
documentation and a tutorial vignette are part of the Metaboseek R package[58]. Individual
functions for spectra comparison, merging spectra and filtering molecular formulae have been
moved to the companion R package MassTools[59], with source code and documentation
available at https://github.com/mjhelf/MassTools and https:/doi.org/10.5281/zenodo.5725620.
The Metaboseek tutorial is also available at https://metaboseek.com/doc.

Acknowledgements. This research was supported in part by the National Institutes of Health
(R35GM131877 and U01GM110714 to F.C.S.). F.C.S. is a Faculty Scholar of the Howard
Hughes Medical Institute. M.J.H received a Research Fellowship from the Deutsche
Forschungsgemeinschaft (DFG), Project Number 386228702. Some strains used in this work
were provided by the CGC, which is funded by the NIH Office of Research Infrastructure
Programs (P40 OD010440). *B0334.3(tm6725)* was obtained from the National Bioresource
Project, Tokyo, Japan. We thank Diana Carolina Fajardo Palomino and Gary Horvath for
technical support and David Kiemle for assistance with NMR spectroscopy. We thank Dr. Yong-
Uk Lee and the Walhout lab for kindly sharing the JW1653-1 *E. coli* strain.

Author Contributions. FCS supervised the study. MJH and FCS conceived the Metaboseek
platform. MJH developed the Metaboseek platform. BWF and ABA performed chemical and
biological experiments. YKZ performed syntheses. BWF, MJH, and FCS wrote the paper with
input from all authors.

Competing Interests. The authors declare no competing interests.

References

1.   Zamboni, N., Saghatelian, A. & Patti, G. J. Defining the Metabolome: Size, Flux, and
Regulation. *Molecular Cell* vol. 58 699–706 (2015).

2.   Joshua, W. *et al.* A novel 3-hydroxysteroid dehydrogenase that regulates reproductive
development and longevity. *PLoS Biol.* (2012).

3.   Watson, E. *et al.* Interspecies systems biology uncovers metabolites affecting C. elegans
gene expression and life history traits. *Cell* (2014) doi:10.1016/j.cell.2014.01.047.

4.   O'Donnell, M. P., Fox, B. W., Chao, P. H., Schroeder, F. C. & Sengupta, P. A
neurotransmitter produced by gut bacteria modulates host sensory behaviour. *Nature*
(2020) doi:10.1038/s41586-020-2395-5.

5.   Funabashi, M. *et al.* A metabolic pathway for bile acid dehydroxylation by the gut
microbiome. *Nature* **582**, 566–570 (2020).

6.   Patti, G. J., Yanes, O. & Siuzdak, G. Innovation: Metabolomics: the apogee of the omics
trilogy. *Nature Reviews Molecular Cell Biology* (2012) doi:10.1038/nrm3314.

7.   Guijas, C., Montenegro-Burke, J. R., Warth, B., Spilker, M. E. & Siuzdak, G.
Metabolomics activity screening for identifying metabolites that modulate phenotype. *Nat.*
Biotechnol. 2018 364 **36**, 316–320 (2018).

8.   Wishart, D. S. Metabolomics for investigating physiological and pathophysiological
processes. *Physiol. Rev.* **99**, 1819–1875 (2019).

9.   Johnson, C. H., Ivanisevic, J. & Siuzdak, G. Metabolomics: Beyond biomarkers and
towards mechanisms. *Nature Reviews Molecular Cell Biology* (2016)
doi:10.1038/nrm.2016.25.

10. Walker, D. I. *et al.* The metabolome: A key measure for exposome research in
epidemiology. *Curr. Epidemiol. reports* **6**, 93 (2019).

11. Da Silva, R. R., Dorrestein, P. C. & Quinn, R. A. Illuminating the dark matter in
metabolomics. *Proc. Natl. Acad. Sci. U. S. A.* **112**, 12549–12550 (2015).

12. Sindelar, M. & Patti, G. J. Chemical Discovery in the Era of Metabolomics. *J. Am. Chem.*
Soc. **142**, 9097–9105 (2020).

13.   Mahieu, N. G. & Patti, G. J. Systems-Level Annotation of a Metabolomics Data Set
Reduces 25 000 Features to Fewer than 1000 Unique Metabolites. *Anal. Chem.* **89**,
10397–10406 (2017).

14.   Baker, M. Metabolomics: From small molecules to big ideas. *Nat. Methods* (2011)
doi:10.1038/nmeth0211-117.

15.   Wanders, R. J. A., Waterham, H. R. & Ferdinandusse, S. Metabolic interplay between
peroxisomes and other subcellular organelles including mitochondria and the
endoplasmic reticulum. *Frontiers in Cell and Developmental Biology* (2016)
doi:10.3389/fcell.2015.00083.

16.   Artyukhin, A. B. *et al.* Metabolomic 'dark Matter' Dependent on Peroxisomal β-Oxidation
in Caenorhabditis elegans. *J. Am. Chem. Soc.* (2018) doi:10.1021/jacs.7b11811.

17.   Pluskal, T., Castillo, S., Villar-Briones, A. & Orešič, M. MZmine 2: Modular framework for
processing, visualizing, and analyzing mass spectrometry-based molecular profile data.
BMC Bioinformatics **11**, (2010).

18.   Tsugawa, H. *et al.* MS-DIAL: Data-independent MS/MS deconvolution for comprehensive
metabolome analysis. *Nat. Methods* **12**, 523–526 (2015).

19.   Tsugawa, H. *et al.* A lipidome atlas in MS-DIAL 4. *Nat. Biotechnol. 2020 3810* **38**, 1159–
1163 (2020).

20.   Tautenhahn, R., Patti, G. J., Rinehart, D. & Siuzdak, G. XCMS online: A web-based
platform to process untargeted metabolomic data. *Anal. Chem.* **84**, 5035–5039 (2012).

21.   Chong, J. *et al.* MetaboAnalyst 4.0: Towards more transparent and integrative
metabolomics analysis. *Nucleic Acids Res.* **46**, W486–W494 (2018).

22.   Kuhl, C., Tautenhahn, R., Böttcher, C., Larson, T. R. & Neumann, S. CAMERA: An
Integrated Strategy for Compound Spectra Extraction and Annotation of Liquid
Chromatography/Mass Spectrometry Data Sets. *Anal. Chem.* **84**, 283–289 (2012).

23.   Dührkop, K. *et al.* SIRIUS 4: a rapid tool for turning tandem mass spectra into metabolite
structure information. *Nat. Methods* (2019) doi:10.1038/s41592-019-0344-8.

24.   Djoumbou-Feunang, Y. *et al.* Cfm-id 3.0: Significantly improved esi-ms/ms prediction and

compound identification. *Metabolites* **9**, (2019).

25.   Watrous, J. *et al.* Mass spectral molecular networking of living microbial colonies. *Proc.*
Natl. Acad. Sci. U. S. A. **109**, E1743–E1752 (2012).

26.   Duy Nguyen, D. *et al.* MS/MS networking guided analysis of molecule and gene cluster
families. (2013) doi:10.1073/pnas.1303471110.

27.   Nothias, L. F. *et al.* Feature-based molecular networking in the GNPS analysis
environment. *Nat. Methods* **17**, 905–908 (2020).

28.   Foulon, V. *et al.* Purification, molecular cloning, and expression of 2-hydroxyphytanoyl-
CoA lyase, a peroxisomal thiamine pyrophosphate-dependent enzyme that catalyzes the
carbon-carbon bond cleavage during alpha -oxidation of 3-methyl-branched fatty acids.
Proc. Natl. Acad. Sci. **96**, 10039–10044 (1999).

29.   Mukherji, M. *et al.* The chemical biology of branched-chain lipid metabolism. *Progress in*
Lipid Research (2003) doi:10.1016/S0163-7827(03)00016-X.

30.   Croes, K., Foulon, V., Casteels, M., Van Veldhoven, P. P. & Mannaerts, G. P. Phytanoyl-
CoA hydroxylase: Recognition of 3-methyl-branched acyl-CoAs and requirement for GTP
or ATP and Mg2+ in addition to its known hydroxylation cofactors. *J. Lipid Res.* **41**, 629–
636 (2000).

31.   Wanders, R. J. A., Komen, J. & Ferdinandusse, S. Phytanic acid metabolism in health
and disease. *Biochimica et Biophysica Acta - Molecular and Cell Biology of Lipids* (2011)
doi:10.1016/j.bbalip.2011.06.006.

32.   Bandu, M. L., Grubbs, T., Kater, M. & Desaire, H. Collision induced dissociation of alpha
hydroxy acids: Evidence of an ion-neutral complex intermediate. *Int. J. Mass Spectrom.*
(2006) doi:10.1016/j.ijms.2006.01.004.

33.   Wanders, R. J. A., Komen, J. & Kemp, S. Fatty acid omega-oxidation as a rescue
pathway for fatty acid oxidation disorders in humans. *FEBS Journal* (2011)
doi:10.1111/j.1742-4658.2010.07947.x.

34.   Gao, A. W. *et al.* A sensitive mass spectrometry platform identifies metabolic changes of
life history traits in C. elegans. *Sci. Rep.* **7**, 1–14 (2017).

35.   Artyukhin, A. B., Yim, J. J., Cheong Cheong, M. & Avery, L. Starvation-induced collective
behavior in C. elegans. *Sci. Rep.* (2015) doi:10.1038/srep10647.

36.   Watts, J. L. & Ristow, M. Lipid and carbohydrate metabolism in Caenorhabditis elegans.
Genetics **207**, 413–446 (2017).

37.   Kniazeva, M., Crawford, Q. T., Seiber, M., Wang, C. Y. & Han, M. Monomethyl branched-
chain fatty acids play an essential role in Caenorhabditis elegans development. *PLoS*
Biol. **2**, (2004).

38.   Grogan, D. W. & Cronan, J. E. Cyclopropane ring formation in membrane lipids of
bacteria. *Microbiol. Mol. Biol. Rev.* **61**, 429–441 (1997).

39.   Brooks, K. K., Liang, B. & Watts, J. L. The influence of bacterial diet on fat storage in C.
elegans. *PLoS One* (2009) doi:10.1371/journal.pone.0007545.

40.   Baba, T. *et al.* Construction of Escherichia coli K-12 in-frame, single-gene knockout
mutants: The Keio collection. *Mol. Syst. Biol.* (2006) doi:10.1038/msb4100050.

41.   Kaul, T. K., Reis Rodrigues, P., Ogungbe, I. V., Kapahi, P. & Gill, M. S. Bacterial fatty
acids enhance recovery from the dauer larva in Caenorhabditis elegans. *PLoS One*
(2014) doi:10.1371/journal.pone.0086979.

42.   Caligiani, A., Nocetti, M., Lolli, V., Marseglia, A. & Palla, G. Development of a
Quantitative GC-MS Method for the Detection of Cyclopropane Fatty Acids in Cheese as
New Molecular Markers for Parmigiano Reggiano Authentication. *J. Agric. Food Chem.*
(2016) doi:10.1021/acs.jafc.6b00913.

43.   Lolli, V., Dall'Asta, M., del Rio, D. & Caligiani, A. Identification of Cyclopropane Fatty
Acids in Human Plasma after Controlled Dietary Intake of Specific Foods. *Nutrients* **12**,
1–10 (2020).

44.   Sud, M. *et al.* Metabolomics Workbench: An international repository for metabolomics
data and metadata, metabolite standards, protocols, tutorials and training, and analysis
tools. *Nucleic Acids Res.* **44**, D463–D470 (2016).

45.   Aron, A. T. *et al.* Reproducible molecular networking of untargeted mass spectrometry
data using GNPS. *Nat. Protoc.* **15**, 1954–1991 (2020).

46.   Alseekh, S. *et al.* Mass spectrometry-based metabolomics: a guide for annotation,
699   quantification and best reporting practices. *Nat. Methods* **18**, 747–756 (2021).

700   47.   Wang, M. *et al.* Sharing and community curation of mass spectrometry data with Global
701   Natural Products Social Molecular Networking. *Nature Biotechnology* vol. 34 828–837
702   (2016).

703   48.   Petras, D. *et al.* GNPS Dashboard: Collaborative Analysis of Mass Spectrometry Data in
704   the Web Browser. *bioRxiv* 2021.04.05.438475 (2021) doi:10.1101/2021.04.05.438475.

705   49.   Horai, H. *et al.* MassBank: a public repository for sharing mass spectral data for life
706   sciences. *J. Mass Spectrom.* **45**, 703–714 (2010).

707   50.   Blaženović, I., Kind, T., Ji, J. & Fiehn, O. Software Tools and Approaches for Compound
708   Identification of LC-MS/MS Data in Metabolomics. *Metabolites* **8**, (2018).

709   51.   Schrimpe-Rutledge, A. C., Codreanu, S. G., Sherrod, S. D. & McLean, J. A. Untargeted
710   Metabolomics Strategies—Challenges and Emerging Directions. *J. Am. Soc. Mass
711   Spectrom.* **27**, 1897–1905 (2016).

712   52.   Viant, M. R., Kurland, I. J., Jones, M. R. & Dunn, W. B. How close are we to complete
713   annotation of metabolomes? *Current Opinion in Chemical Biology* vol. 36 64–69 (2017).

714   53.   Mize, C. E., Steinberg, D., Avigan, J. & Fales, H. M. A pathway for oxidative degradation
715   of phytanic acid in mammals. *Biochem. Biophys. Res. Commun.* **25**, 359–365 (1966).

716   54.   Mize, C. E. *et al.* A major pathway for the mammalian oxidative degradation of phytanic
717   acid. *Biochim. Biophys. Acta - Lipids Lipid Metab.* **176**, 720–739 (1969).

718   55.   Barstead, R. *et al.* Large-scale screening for targeted knockouts in the caenorhabditis
719   elegans genome. *G3 Genes, Genomes, Genet.* **2**, 1415–1425 (2012).

720   56.   Artyukhin, A. B., Schroeder, F. C. & Avery, L. Density dependence in Caenorhabditis
721   larval starvation. *Sci. Rep.* (2013) doi:10.1038/srep02777.

722   57.   MC, C. *et al.* A cross-platform toolkit for mass spectrometry and proteomics. *Nat.
723   Biotechnol.* **30**, 918–920 (2012).

724   58.   Helf, M. J. mjhelf/Metaboseek: v0.9.9. (2021) doi:10.5281/ZENODO.3360087.

725   59.   Helf, M. J. mjhelf/MassTools: MassTools Version 0.2.12. (2021)

726   doi:10.5281/ZENODO.5725620.

Figure 1. Comparative Metabolomics with Metaboseek. **a,** Metaboseek includes an integrated XCMS module for feature detection and feature grouping (with CAMERA annotation) and accepts feature tables generated by other software. **b,** Features can be annotated and prioritized using extensive filtering options and integrated statistics tools. Raw data for each molecular feature can be browsed rapidly, including associated EICs, MS1 and MS/MS spectra. **c**, The data browser interacts with a suite of structure elucidation tools, e.g., SIRIUS-based molecular formula and structure prediction, the *Label Finder* to identify isotope-labeled compounds, and the MS/MS pattern finder to identify MS features with characteristic fragmentation patterns.

Figure 2. Comparative metabolomics of CA-fed *hacl-1* mutants. **a,** Conservation of peroxisomal
α-oxidation in *C. elegans* and humans. **b,** CA-feeding experiment. *C. elegans* larvae were
supplemented with CA, (**6**) followed by comparative analysis with Metaboseek. **c,** *hacl-*
1(tm6725) mutants harbor a genomic deletion (red line) spanning the indicated exon splice
junction, orange rectangles represent exons, black lines represent introns. **d,** Representative
shunt metabolites accumulating in *hacl-1* following CA supplementation. The majority of shunt
metabolites fragment between the carbonyl- and α-carbon during MS/MS, which is characteristic
of α-hydroxy fatty acids. **e,** HPLC-MS (negative ion) EIC for *hacl-1*-enriched feature with *m/z*
185.1182, corresponding to **7** (arrow). Its MS/MS spectrum reveals a product ion at *m/z*
139.1123, corresponding to neutral loss of formic acid.

Figure 3. Endogenous metabolites accumulating in *hacl-1* mutant larvae. **a,** MS/MS network highlighting differential abundance in *hacl-1* mutants relative to WT. Subnetworks of interest (orange boxes) are shown enlarged. **b,** Quantification of endogenous metabolites ten-fold or more enriched in *hacl-1* larvae relative to WT at $p < 0.05$. Metabolites in red produce an MS/MS product ion with *m/z* 72.993. Data represent five independent experiments and bars means ± standard deviation. **c,** Representative HPLC-MS (negative ion) EICs and MS/MS spectra for most abundant differential metabolites in **b**, bemeth#3 (**11**) and bemeth#2 (**12**). **d,** Overview of synthetic scheme to afford bemeth#2 (see Methods for details). **e,** Comparison of HPLC-MS (negative ion) EICs for synthetic diastereomers of bemeth#2 (**12**) and the corresponding metabolites in *exo*-metabolome extracts from WT and *hacl-1* larvae.

Figure 4. MS/MS network comparing *exo*-metabolomes of *hacl-1* and WT adults. Proposed

structures and major fragmentation reactions are shown for five subnetworks (SN1 – SN5,

orange boxes). Example compounds in the bar graphs are at least 10-fold enriched in *hacl-1*

mutants relative to WT and satisfy mean intensity criteria (10^6 for SN1, SN2, SN3; $5*10^5$ for

SN5). R represents an acyl group with N carbons and n degrees of unsaturation (N:n), preceded

by *m* or *d* for *m*ono- or *d*i-oxygenated. The structure of the most abundant metabolite in SN3,

GLEA-m16:1 (**16**), was characterized via 2D NMR spectroscopy. For compounds from SN4, see

Supplementary Figure 10. Data represent six (WT) or five (*hacl-1*) samples from three

biologically independent experiments and bars means ± standard deviation.

Figure 5. Cyclopropane-containing glycolipids are enriched in *hacl-1* mutants. **a,** Leucine metabolism feeds into branched-chain fatty acid (BCFA) biosynthesis in *C. elegans*. **b,** Pairwise analysis of Leu or $^{13}C_6$-Leu-supplemented worms using the *Label Finder* revealed $^{13}C_5$-enriched NAEs derived from BCFAs. Shown are representative HPLC-MS (ESI+) EICs and dotted lines represent incorporation of $^{13}C_5$ ($\Delta m/z$, 5.0167), as visualized using Metaboseek *Mass Shifts*. **c,** Study design for comparative metabolomics of WT and *hacl-1* worms fed either *E. coli* OP50 or cyclopropane fatty acid-deficient *E. coli* JW1653-1. **d**, Representative HPLC-MS (ESI-) EIC for 496.2317, corresponding to cyclopropane-containing *N*-acyl GPE 13:1 (**17**). Shown structure was proposed based on MS/MS fragmentation and absence in JW1653-1. **e**, Quantification of

N-acyl GPEs that were absent from worms fed JW1653-1. Data represent six (WT) or five (*hacl-*

1) samples from three biologically independent experiments and bars means ± SD. **f**,

Representative HPLC-MS (ESI-) EIC for *m/z* 570.2674, corresponding to cyclopropane-

containing GLEA 13:1 (**18**). Shown structure was proposed based on MS/MS fragmentation and

absence in JW1653-1. Asterisks (*) mark isobaric *hacl-1*-enriched features that are not

impacted by JW1653-1 diet. **g,** Proposed metabolism of bacterial 17:1 (or 19:1) cyclopropane

lipids. Three (or four) rounds of β-oxidation would produce an 11:1 cyclopropane fatty acid

unsuitable for further β-oxidation that could be a substrate for α- or ω-oxidation.