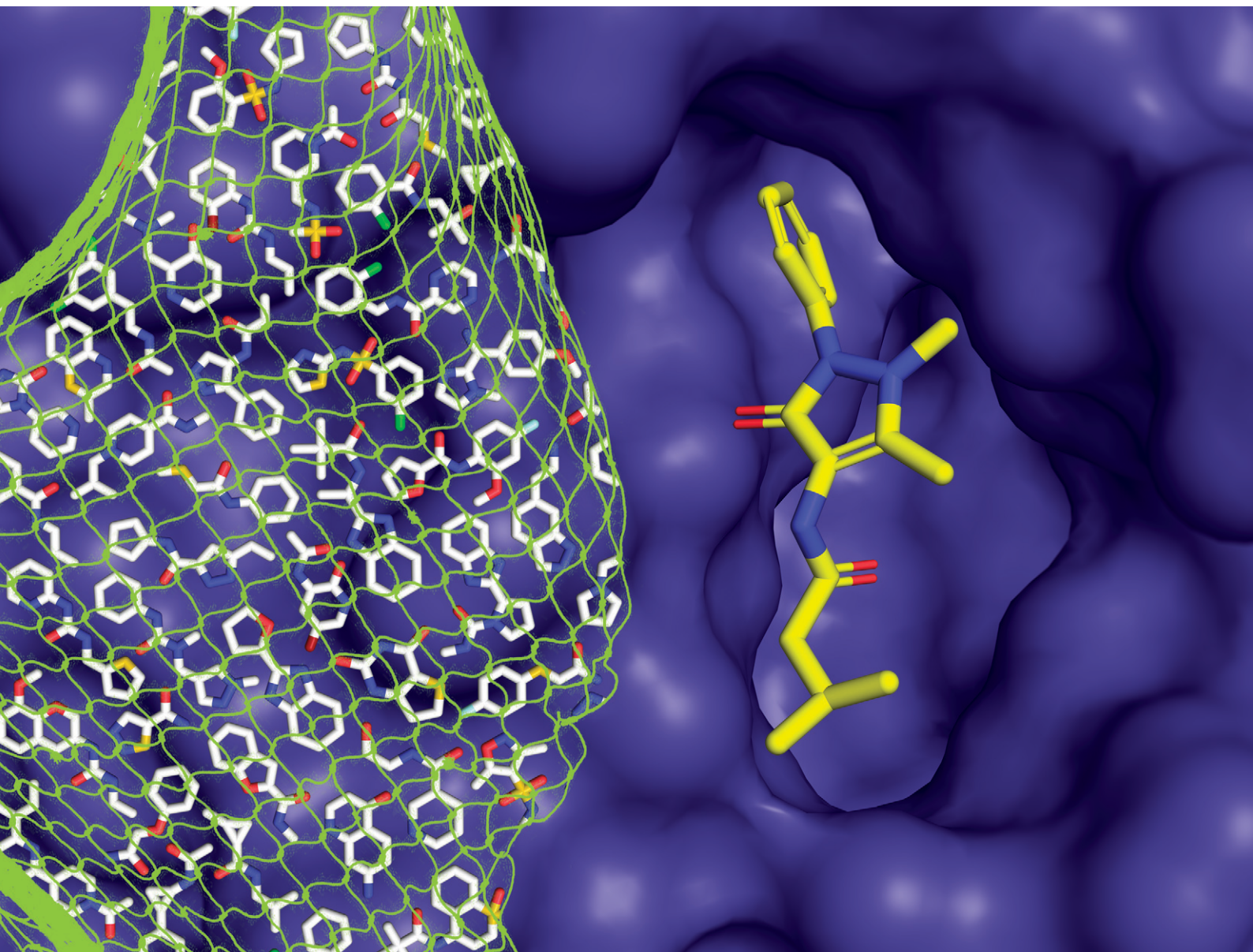


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**RESEARCH ARTICLE**

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# Design, quality and validation of the EU-OPENSREEN fragment library poised to a high-throughput screening collection†

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The EU-OPENSREEN (EU-OS) European Research Infrastructure Consortium (ERIC) is a multinational, not-for-profit initiative that integrates high-capacity screening platforms and chemistry groups across Europe to facilitate research in chemical biology and early drug discovery. Over the years, the EU-OS has assembled a high-throughput screening compound collection, the European Chemical Biology Library (ECBL), that contains approximately 100 000 commercially available small molecules and a growing number of thousands of academic compounds crowdsourced through our network of European and non-European chemists. As an extension of the ECBL, here we describe the computational design, quality control and use case screenings of the European Fragment Screening Library (EFSL) composed of 1056 mini and small chemical fragments selected from a substructure analysis of the ECBL. Access to the EFSL is open to researchers from both academia and industry. Using EFSL, eight fragment screening campaigns using different structural and biophysical methods have successfully identified fragment hits in the last two years. As one of the highlighted projects for antibiotics, we describe the screening by Bio-Layer Interferometry (BLI) of the EFSL, the identification of a 35  $\mu\text{M}$  fragment hit targeting the beta-ketoacyl-ACP synthase 2 (FabF), its binding confirmation to the protein by X-ray crystallography (PDB 8PJ0), its subsequent rapid exploration of its surrounding chemical space through hit-picking of ECBL compounds that contain the fragment hit as a core substructure, and the final binding confirmation of two follow-up hits by X-ray crystallography (PDB 8R0I and 8R1V).

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† Electronic supplementary information (ESI) available: Most frequent functional groups in EFSL, structures of the 17 fragment hits from the BLI screening of EFSL in the FabF project, structures of the 7 hits poised from the ECBL in the FabF project, X-ray data collection and refinement statistics, distributions of eight calculated descriptors for different fragment libraries, sensorgrams and steady-state plots of the 17 fragment hits from the BLI screening of EFSL in the FabF project, sensorgrams and steady-state plots of the 7 hits poised from the ECBL in the FabF project, steady-state plots in triplicate of repurchased material for the two co-crystallised poised hits. See DOI: <https://doi.org/10.1039/d3md00724c>

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## Introduction

Over the last twenty-five years, fragment-based screening has become a well-established drug discovery strategy for hit generation.<sup>1</sup> In contrast to conventional high-throughput screening (HTS) technologies, fragment-based drug discovery (FBDD) relies on screening low numbers of less complex low molecular weight molecules to find low affinity chemical fragments that bind with high efficiency to disease-relevant targets.<sup>2</sup> In the event that fragment hits are identified, grow and link strategies are applied to further optimize fragments into potent small molecule leads.<sup>3,4</sup> The use of FBDD has proven to be a successful approach to generate leads for a wide diversity of proteins covering all target classes,<sup>5</sup> leading to multiple clinical candidates, some of which ultimately resulting in marketed drugs.<sup>6</sup>

Fragment hits are often efficient protein binders<sup>7</sup> but their small size results usually in weak binding affinities.<sup>8</sup> Therefore, the techniques used to detect fragment binding have to be highly sensitive at the low  $\mu\text{M}$  to mM scale. A range of biophysical methods such as Nuclear Magnetic Resonance (NMR), Surface Plasmon Resonance (SPR), Grating-Coupled Interferometry (GCI), Thermal Shift (TS), Microscale Thermophoresis (MTS), Biolayer Interferometry (BLI), Isothermal Titration Calorimetry (ITC), X-ray crystallography, and biochemical assays at high concentration are used to screen purposely designed fragment libraries and to identify low-affinity binders.<sup>9–14</sup> These fragment libraries are usually provided by chemical vendors or assembled in-house,<sup>15</sup> and they contain small molecules that comply with pre-defined fragment-like properties, such as the rule-of-three (Ro3),<sup>16</sup> but are also chemically diverse and have high aqueous solubility.<sup>17</sup>

In this work we introduce a new fragment library developed by EU-OPENSREEN (EU-OS), the European Research Infrastructure Consortium (ERIC) for drug discovery and chemical biology (<https://www.eu-openscreen.eu/services/compound-collection/fragment-library-fbld.html>). EU-OS is an international, distributed non-for-profit initiative that provides high-throughput screening and medicinal chemistry support to academia and industry. Beyond its academic network of partners, EU-OS offers access to the European Chemical Biology Library (ECBL), a thoroughly designed diversity set consisting of approximately 100 000 small molecules selected from commercial sources.<sup>18</sup> Under the framework of the EC-funded project EU-OS DRIVE, the European Fragment Screening Library (EFSL) poised to ECBL compounds was designed to facilitate rapid fragment-to-lead progression. The EFSL is the result of collaborative efforts between EU-OS ERIC researchers (<https://www.eu-openscreen.eu/>) with structural biology experts from Instruct ERIC (<https://instruct-eric.org/>) and the iNEXT-Discovery (<https://inext-discovery.eu/>) consortia. They joined forces to offer a complete pipeline of services and resources from fragment hit identification and confirmation to follow-up support on fragment growth and optimization, including access to biochemical assays and chemoinformatics tools to accelerate chemical probe discovery and FBDD. By making EFSL available to the worldwide research community,<sup>19</sup> both from academia and industry, we have been able to collect intrigued and valuable information on

library performance in a variety of projects on multiple diverse targets over the last two years that is helping us to refine the composition of EFSL.

## Results and discussion

### Design criteria of EFSL

To build a library of chemical fragments that has a good representativity of ECBL and that it is also easily accessible, the Enamine Fragment Collection (<https://enamine.net/compound-collections/fragment-collection>) was taken into account as the reference fragment set. The 110 557 chemical fragments of this collection were used to perform a substructural search on the 96 096 compounds in ECBL. The search was done using the RDKit library (<https://www.rdkit.org>) and resulted in a preliminary list of 39 440 candidate fragments.

A workgroup comprising members of the EU-OS, Instruct ERIC and iNext-Discovery consortia agreed on a series of priority criteria to select the minimum number of candidate fragments that would represent the widest coverage of ECBL. Additionally, it was decided to include as many of the 80 minifrag as possible described by O'Reilly *et al.*<sup>20</sup> Up to 14 of them were found among the candidate fragments, while another 33 were found to be similar to a selected fragment (MACCS keys with a Tanimoto similarity  $\geq 0.8$ ). These 47 fragments were directly included in the final list. The remaining candidate fragments were grouped using a Butina clustering,<sup>21</sup> as implemented in RDKit and using a cutoff of 0.1 with MACCS keys as fingerprints, resulting in 19 617 fragment clusters. All fragments in each cluster were then sorted according to their coverage of EU-OS compounds (*i.e.* the number of compounds in the ECBL that have the fragment as a substructure) and the following priority criteria were applied to select a fragment within each cluster: i) diversity: Tanimoto similarity of MACCS keys  $\leq 0.7$  to any already selected fragment; ii) coverage: above the 90th percentile of the ECBL coverage distribution for all fragments; iii) size: molecular weight (MW) under the 10th percentile of the MW distribution within the cluster; iv) solubility:  $\log P \leq 3$ ; v) fluorination: number of fluorine atoms above the 90th percentile of the distribution of fluorine presence in structures within the cluster. The application of these criteria led to a selection of 1785 fragment centroids that covered a substructural portion of 87.7% of the compounds in ECBL.

Finally, to enhance the probability that a chosen fragment had to be a substructure of multiple ECBL compounds, and thus assuring multiple follow-up compounds to the chosen fragment, we finally ranked fragments by descending number of *modification vectors*. We defined modification vectors as the number of hydrogens and aromatic halogen atoms contained in the fragment which could be substituted by a heavy atom with a single bond. Naturally, not all hydrogens and halogens can be easily modified by common synthetic routes to replace them with a heavy atom, so we practically rewarded those fragments possessing hydrogens attached to heteroatoms [O,N], aromatic chlorine or bromine (also useful for MS-driven screening<sup>22</sup>) and number of fluorine atoms (for NMR-driven screening<sup>23</sup>).



Implicitly, this definition also smoothed the obvious tendency to reward larger fragments against smaller ones. In the end, the application of all criteria led to a total of 1056 fragments (968 frags and 88 minifrags) that composed the final EFSL. The entire library design protocol is summarized in Fig. 1.

The property profile of the final EFSL composition was calculated with RDKit and included eight descriptors, namely, molecular weight (MW), heavy atom count (HAC), Wildman–Crippen log *P* value (Log *P*), number of hydrogen-bond donors (HBD) and acceptors (HBA), topological polar surface area (TPSA), number of rotational bonds (nRot), and the fraction of sp<sup>3</sup> carbon atoms (fsp<sub>3</sub>). The boxplot distributions of these eight properties are collected in Fig. 2. As it can be observed, the EFSL is Ro3 compliant and fit well with the property profiles reported for some of the most recent fragment libraries developed.<sup>24–26</sup> A closer look at the comparative property profiles of EFSL with the DSI-poised library from XChem in Oxford<sup>24</sup> and F2X library from the Berlin Synchrotron (BESSY)<sup>25</sup> reveals that fragments in EFSL are slightly smaller than fragments in F2X and DSI-poised (Fig. S1†).

Finally, the presence in the structures of EFSL fragments of the most common functional groups and linkers in bioactive molecules<sup>27–29</sup> was also analyzed (Table S1†). It was found that each of the top-10 most common functional groups was present in at least 4.2% of the EFSL collection (that is, 44 fragments), except for the carboxyl group that was found to be particularly under-represented (0.3% of EFSL).

### Quality control of the EFSL

Screening campaigns can be performed with commercial or user-defined fragment libraries. However, this requires addi-

tional structure compliance and quality control of fragments, solubility checks in buffer-of-choice for the target, verification of fragment concentration, and design of fragment mixtures. Instead, for standardization within EU-OS and beyond, we propose to use the defined and verified EFSL that consists of 1056 fragments. For this purpose, we applied NMR methods and protocols for quality assessment which were previously utilized with success and benchmarked for fragment libraries.<sup>30</sup>

The fragments in EFSL were delivered as 100 mM (or 1000 mM for the minifrags) stock solutions in 100% d<sub>6</sub>-DMSO. A working stock of 50 mM (or 500 mM for the minifrags) was prepared using 90% d<sub>6</sub>-DMSO and 10% D<sub>2</sub>O. In order to confirm the integrity and also assess the solubility of the fragments, <sup>1</sup>H-NMR spectra of the individual fragments with a final concentration of 1 mM (or 10 mM for the mini fragments) in 25 mM sodium phosphate buffer, 150 mM NaCl, 5% d<sub>6</sub>-DMSO, and 10 μM sodium trimethyl silyl propane sulfonate (DSS) at pH 7.5 were acquired. DSS was used both as an internal chemical reference and quantification standard. Using our previously established semi-automatic method of analysis,<sup>30</sup> we categorized the fragments as either “consistent” (QC passed) or “inconsistent” (QC failed).

Out of the initial 1056 compounds, 913 (86.5%) were deemed “QC passed” and 143 (13.5%) “QC failed” (Fig. 3). The most common reasons for inconsistency included solubility issues and additional or missing signals in the spectra. In general, by NMR the concentration of the substance is determined relative to the known concentration of a standard. To achieve this, a fragment with very good solubility in the buffer was defined as an *Eretic Reference*.<sup>30</sup> The concentration

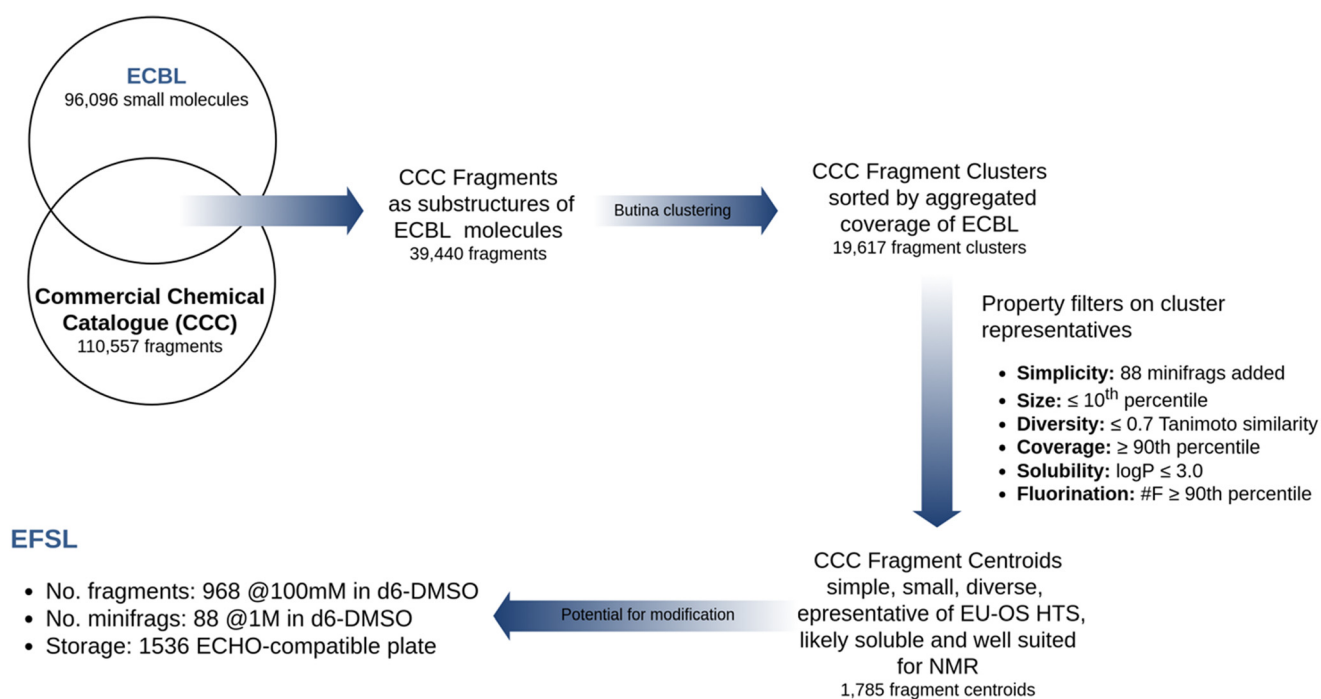
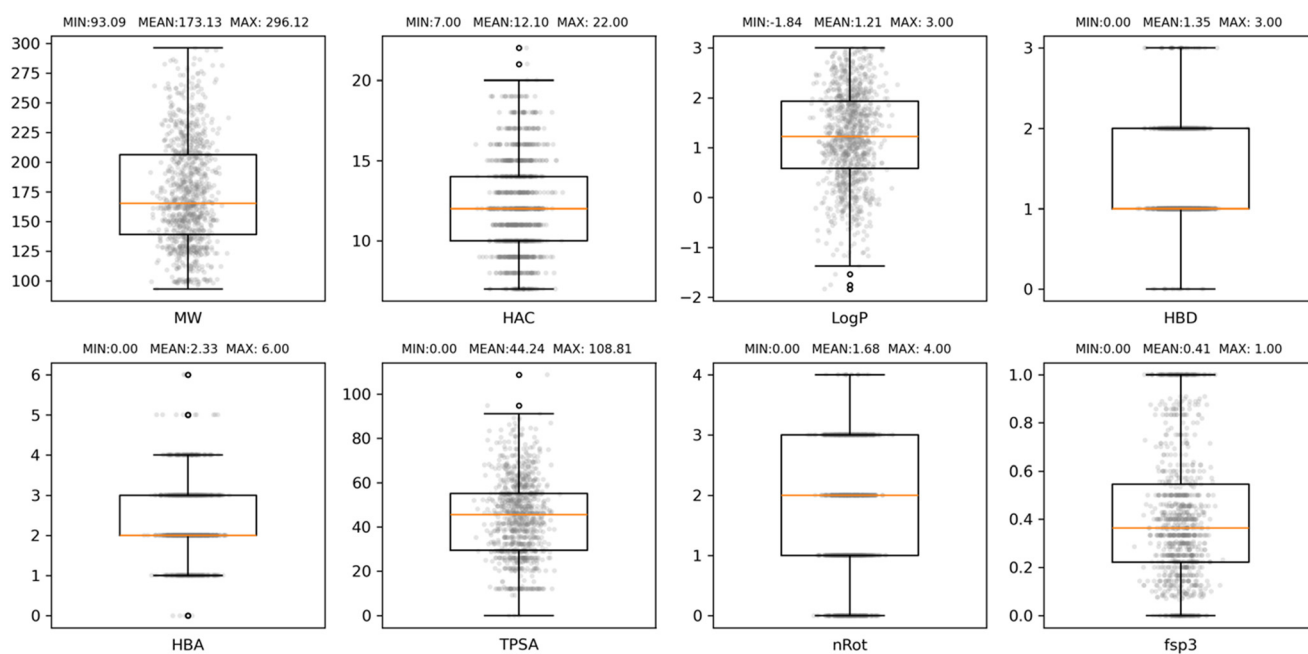
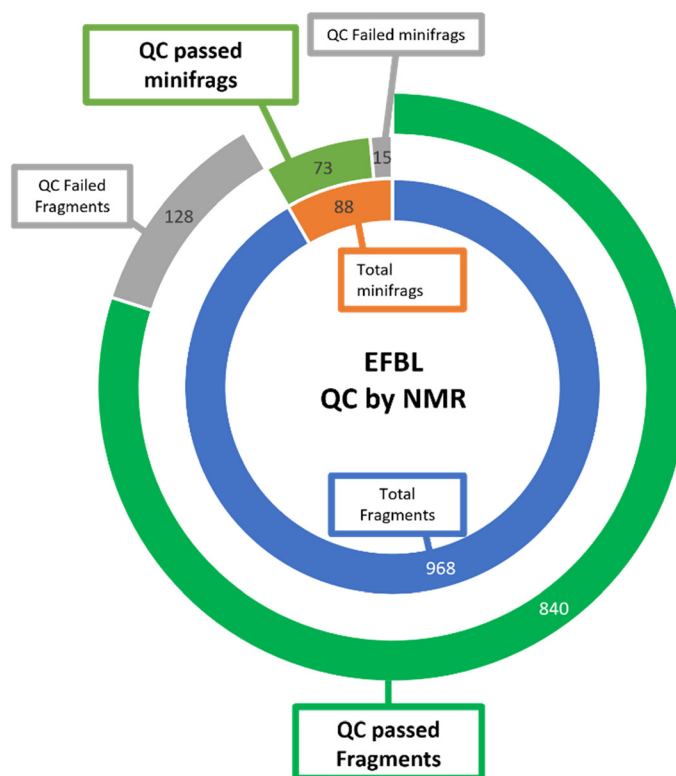
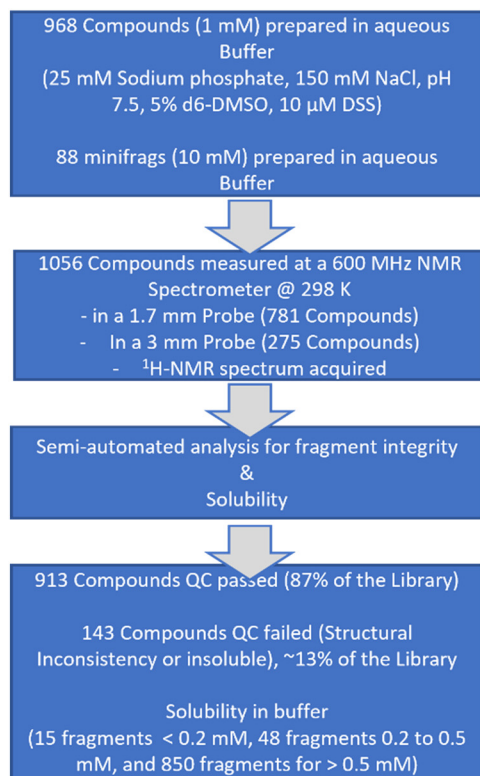


Fig. 1 Design flowchart of the EFSL poised to the ECBL.





**Fig. 2** Boxplot distributions of eight properties commonly used to characterise fragment libraries, namely, molecular weight (MW), heavy atom count (HAC), Wildman–Crippen log *P* value (Log *P*), number hydrogen-bond donors (HBD) and acceptors (HBA), topological polar surface area (TPSA), number of rotational bonds (nRot), and the fraction of sp<sup>3</sup> carbon atoms (fsp3). The box defines the interquartile range (IQR) of values. The lower and upper whiskers show the lowest and highest values that are 1.5 IQR below the first quartile and above the third quartile, respectively. The orange line marks the median value.



**Fig. 3** NMR-based quality control of EFSL. (Left) schematic representation of the workflow and results. (Right) doughnut graph summarizing the QC results of EFSL.



of this reference was set to its nominal concentration of 1 mM that was pipetted and using the automated tool Complete Molecular Confidence-assist (CMCa), the concentration of all other fragments were determined relative to this *Eretic Reference*. Accordingly, for the minifrag a second *Eretic Reference* was defined, and its nominal concentration set to 10 mM and then used to determine the relative concentration of the minifrag. All fragments were then clustered into one of three categories according to their solubility of <0.2 mM, 0.2–0.5 mM, and >0.5 mM, the minifrag stayed as their own category. It resulted in a population of the three categories of 15 fragments for <0.2 mM, 48 fragments for 0.2–0.5 mM, and 850 fragments for >0.5 mM. As a result, the identified poorly soluble fragments (<0.2 mM) and the “QC failed” fragments will be replaced by more stable and soluble fragments in a future version of the EFSL.

### Summary of screening campaigns using the EFSL

The EFSL is available to researchers for fragment screening projects at several EU-OS and iNEXT-Discovery and/or Instruct ERIC partners. The open access to EFSL is offered by the EU-OS ERIC, which acts as a single point of contact for interested users as outlined in Fig. 4. Depending on the research infrastructure (e.g. EU-OS ERIC or Instruct ERIC), users are invited to submit a full application indicating the project idea and main scientific goals. Proposals are subjected to a peer-review evaluation by independent reviewers to ensure the scientific quality of research. Additionally, users are requested to submit a user declaration form to EU-OS ERIC via the online application platform ARIA (<https://apply.eu-openscreen.eu/submit-call/eu-openscreen-fragment-library>). Specific to the details of the proposals, a project can take place at one or multiple EU-OS and/or Instruct-ERIC/iNEXT-Discovery sites. After completion of the fragment screening, every researcher will be able to quickly follow up fragment hits by searching the ECBL for small molecules containing the fragment substructure of one or more fragments. Moreover, users can benefit from the access to EU-OS chemistry partners to start, in a timely and cost-effective manner, their fragment-to-lead optimisation projects. Fragment screening data will be made available to researchers using open access databases such as ECBD (<https://ecbd.eu/>).

One of the intrinsic added assets of EFSL lies in its close link to small molecules available in ECBL, a screening collection of almost 100 000 diverse commercially available compounds. By consultation of the EU-OS chemistry sites, suitable small molecules from ECBL containing the fragment structures can be quickly tested in the relevant assays. Over the last three years, several research groups have benefited from access to EFSL in their screening campaigns and the statistics on the results obtained are collected in Table 1.

This track record analysis on the use of EFSL highlights the diversity of applicable screening technologies used and the variety of hit selection criteria of the projects. Up to five different techniques were employed in this set of eight screening projects: two opted for X-ray crystallography as pri-

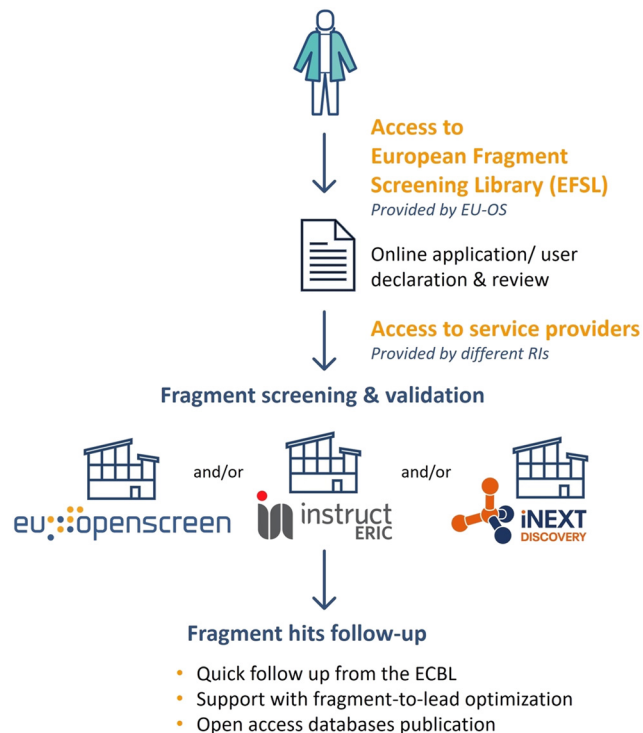


Fig. 4 Access to the EFSL and screening services.

mary screening technology, another three used BLI, and the remaining three applied SAXS, NMR, and TS. On average, a hit rate of  $7.1\% \pm 10.6\%$  was obtained considering all eight screening campaigns ( $2.4\% \pm 1.1\%$  if the three screening campaigns with significantly lower, 0.1%, and higher, 13.0% and 31.3%, hit rates are considered as outliers).

One of the first applications of EFSL, albeit without the 88 minifrag, was in the fragment-based crystallographic screening of the Nsp3 macrodomain of SARS-CoV-2.<sup>19</sup> Of the 968 compounds screened, crystal-bound fragments were obtained for 24 at a concentration of 100 mM. Using this criterion, a hit rate of 2.5% was obtained. The other screening project using X-ray crystallography as primary screening technology aimed at identifying fragment hits for endothiasepsin and detected 30 hits from a focused selection of 96 fragments screened (31.25% hit rate). The SAXS project used the full version of the EFSL and it identified 19 compounds with over 30% of inhibited confirmation, resulting in a hit rate of 1.8%. The only screening performed using an NMR methodology, water-ligand observed gradient spectroscopy (wLOGSY), screened a subset of EFSL (1017 compounds) and returned 132 hits for binding to Nsp10/16 complex with at least 20% reduction in signal intensity. This gives a hit rate of 13.0%, a value that is much higher than the average hit rate observed over all campaigns, but it is close to the hit rate obtained by a recent work using the same technique on other fragment libraries.<sup>26</sup> The hit rate for fragments binding to a catalytic site of the Nsp10/16 complex was nonetheless considerably less (0.3%). The antibiotics project using a thermal shift assay identified 4.4% of the full contents of EFSL to have  $\Delta T_m >$





**Table 1** Summary of fragment screening campaigns that have used EFSL in the last three years

Target and/or disease area	No. of fragments screened	Primary screening technology	Hit criteria	No. of hits <sup>e</sup>	Hit rate (%)	Validation technique
Nsp3 macrodomain of SARS-CoV-2 (ref. 19)	968 <sup>a</sup>	X-ray crystallography	Crystal-bound fragment at 100 mM	24	2.5%	X-ray crystallography
Endothiapepsin	96 <sup>b</sup>	X-ray crystallography	Crystal-bound fragment at 100 mM as determined by PanDDA maps	30	31.3%	X-ray crystallography
Antibiotics <i>E. coli</i> enzyme	1056	Small-angle X-ray scattering	30% of inhibited conformation	19	1.8%	Enzyme kinetics: NADH formation monitored by UV absorbance
Nsp10/16 complex/infectious diseases	1017 <sup>c</sup>	NMR (wLOGSY, T1ρ)	WaterLOGSY – signal sign change T1ρ – at least 20% reduction in signal intensity	132/3 (catalytic site)	13.0%/0.3% (catalytic site)	Binders competitive with sinefungin
Threonyl t-RNA synthetase/antibiotics	1056	Thermal shift assay	$\Delta T_m > 1.5$ °C	46	4.4%	N/A
FabF/infectious diseases	1047 <sup>d</sup>	Bio-Layer Interferometry	$K_D < 2$ mM	17	1.6%	X-ray crystallography
FabB/infectious diseases	1047 <sup>d</sup>	Bio-Layer Interferometry	$K_D < 2$ mM	20	1.9%	X-ray crystallography
PanK/infectious diseases	1047 <sup>d</sup>	Bio-Layer Interferometry	$K_D < 2$ mM	1	0.1%	N/A

<sup>a</sup> EFSL without the 88 minifrag. <sup>b</sup> Minimum representative selection of EFSL without the 88 minifrag. <sup>c</sup> Thirty-seven compounds were found insoluble and thus, not tested. <sup>d</sup> Nine compounds were not supplied. <sup>e</sup> Number of hits according to the hit criteria for each screening campaign.

1.5 °C. Finally, for the three screens using BLI, hit rates ranged between 1.5–2.0% for two of them when considering fragments binding with a dissociation constant of less than 2 mM. However, one of them returned a hit rate of 0.1%, much lower than the average hit rate observed over all campaigns. This low hit rate obtained for PanK could be due to the low presence in EFSL of fragments containing carboxylic acids (3/1056), which is precisely the functional group present in the substrate that is deeply buried in the pocket of the PanK binding cavity. This is an illustrative example that the use of EFSL in screening campaigns is providing valuable information on the current limitations and directions on further improvements of both EFSL and ECBL. Accordingly, future enhancements of the EFSL contemplate expanding the current library with fragments containing carboxyl groups and increasing the presence of fragments with some of the most common functional groups and linkers present in bioactive molecules of currently targeted proteins.<sup>27–29</sup>

Some of the fragment-based screening campaigns summarized in Table 1 took advantage of the poised feature of EFSL and ordered some fragment-containing compounds present in ECBL for fast hit follow-up focused activities and exploration of structure–activity relationships. The results are compiled in Table 2.

Based on the 24 fragment hits that were identified from the X-ray crystallography screening of EFSL on the Nsp3 macrodomain of SARS-CoV-2, 20 compounds from ECBL were selected and delivered to Diamond Light Source (XChem group) for X-ray crystallography. Since the objective was to identify larger molecules with more potent affinities, attempts to obtain crystal-bound compounds were made using a concentration of 1 mM (100 times less than the original fragment hits). Unfortunately, this resulted in no hits for this project, an outcome that is not uncommon in real-case scenarios of unconventional protein targets and that deserve to be reported. The same outcome was obtained for the 51 compounds that were ordered from ECBL for the antibiotics *E. coli* enzyme. In contrast, 20 follow-up compounds from ECBL were also ordered for the endothiapepsin project and in this case 2 hits were found to have higher occupancy of the ligand in the crystal (using POLDER maps) compared to the fragment (using PanDDA maps), which is often qualitatively associated with having higher affinity. Finally, the FabF project discussed above selected 147 compounds from ECBL and this action identified 7 molecules with  $K_D$  values below 100 μM, four of them with slightly more potent affinities than the original fragment hit (*vide infra*).

**Table 2** Follow-up ordering of ECBL compounds after successful fragment screening campaigns using EU-OS FBS

Project/target	Technique	ECBL compounds requested	ECBL binders identified	Hit rate (%)
Nsp3 macrodomain of SARS-CoV-2	X-ray crystallography	20	0 crystal-bound compounds at 1 mM	0.0%
Endothiapepsin	X-ray crystallography	20	2 (as determined by POLDER maps)	10.0%
Antibiotics <i>E. coli</i> enzyme	Small-angle X-ray scattering	51	0	0.0%
FabF/infectious diseases	Bio-layer interferometry	147	7 with $K_D < 100$ μM	4.8%



### Fragment hit identification and follow-up against PaFabF

There is an urgent need for new antibiotics, in particular against *P. aeruginosa* and other Gram-negative bacteria.<sup>31</sup> A promising target is beta-ketoacyl-ACP synthase 2 (FabF) which is part of the fatty acid synthesis pathway.<sup>32–34</sup> In an effort to fuel drug discovery, we screened the EFSL against FabF from *P. aeruginosa* (PaFabF) using BLI. BLI is, like SPR, a label-free biosensing technology. Compared to SPR, BLI has found little use in the literature for small molecule research, but some screening campaigns have been reported.<sup>35–36</sup> Further, we have shown that BLI is suitable for affinity determination of FabF ligands.<sup>37</sup> Potent natural product inhibitors of FabF, such as platensimycin, bind to the acyl-bound intermediate state of the enzyme. Thus, our screening efforts included the use of the intermediate state mimicking C164A mutant described earlier in addition to the w.t. enzyme.<sup>37,38</sup>

Fragments in EFSL were screened at a concentration of 500  $\mu\text{M}$  using 96-well plates in a single point assay format. Both FabF variants were biotinylated and loaded to super streptavidin sensors (SSA). Biotin blocked SSA sensors served as reference sensors. To validate the assay performance, platencin was used as control after each screening plate. In the subsequent data analysis, the mean binding response of all compounds to the reference sensors was determined and those having a response outside one standard deviation (1 STD) of the mean were rejected, leaving 617 compounds for further processing. As hit threshold, a response of at least the mean + 1 STD against FabF loaded double referenced sensor signals was chosen.

The hit lists from FabF w.t. and FabF C164A were joined and after visual inspection of the raw data, 74 compounds with values above the hit threshold (hit rate of 7.1%) were identified and progressed to dose–response experiment. Of those, 17 compounds (Table S2†) gave a  $K_D$  lower than 2 mM (confirmed hit rate of 1.6%) against either the C164A or w.t. loaded sensors (Fig. S2†). One of them, fragment hit **1** (EOS102727), exhibited good affinity ( $K_D = 9.8 \mu\text{M}$ ) and selectivity to the mutant enzyme over the w.t., indicating binding close to the modified catalytic triad (Fig. S2†), and it was subsequently repurchased for retesting in triplicate and further validation using X-ray crystallography. The repurchased material of this compound gave a  $K_D$

= 35  $\mu\text{M}$  for FabF C164A while no binding to the w.t. up to a concentration of 2.5 mM was detectable (Fig. 5).

The cocrystal structure of **1** with FabF C164A was determined at 1.5 Å resolution (Fig. 6a and b, Table S4†). A clear electron density was obtained that allowed to place the ligand unambiguously. Based on the binding mode, several favourable interactions with the FabF binding site. The oxygen of the pyrazolone carbonyl was placed in the oxyanion hole formed between the Phe400 and Ala164 backbone amide nitrogen atoms also known to harbour the alcohol of the covalently bound inhibitor cerulenin<sup>39</sup> as well as the thioester oxygen of the natural acyl substrates<sup>40</sup> (Fig. 6c and d). The aliphatic amide oxygen of **1** formed a hydrogen bond with the side chains of the catalytic His304 and His341, comparable to the interactions of the carboxylate group of platensimycin,<sup>37</sup> while the amide nitrogen participated in a water network anchored to the Thr271 backbone *via* HOH235. The extended network was centred around HOH264, which formed a direct interaction with the Gly399 backbone, and water-bridged interactions to the Asp266 and Asn404 side chains and the His169 backbone (Fig. 6c). The phenyl group formed two T-shaped stacking interactions to the adjacent Phe203 and Phe400.

While compound **1** makes several key interactions found in known potent inhibitors (Fig. 6d), it occupies the same space as the acyl substrate and cerulenin and it is neither binding the w.t. or the acyl intermediate (data not shown). Covalent binding of the catalytic cysteine to the acyl substrate induces a rotation of Phe400, resulting in a more accessible binding site, which is mimicked by C164A. To accommodate a ligand like **1** in the w.t. receptor, we hypothesise that a covalent attack would need to take place between Cys164 and an electrophilic analogue of **1**. Efforts are ongoing to synthesize such a compound.

Subsequent hit expansion was rapidly undertaken by virtually screening the ECBL collection for analogues. This revealed 147 compounds containing the same dimethyl-phenyl-pyrazolone motif as found in the hit with variation in the pyrazolone 4-position. All 147 compounds were tested at 100  $\mu\text{M}$  using the BLI assay (five times less than the concentration used in the fragment screening). Twelve compounds were progressed to a dose–response experiment, from which seven compounds had  $K_D$

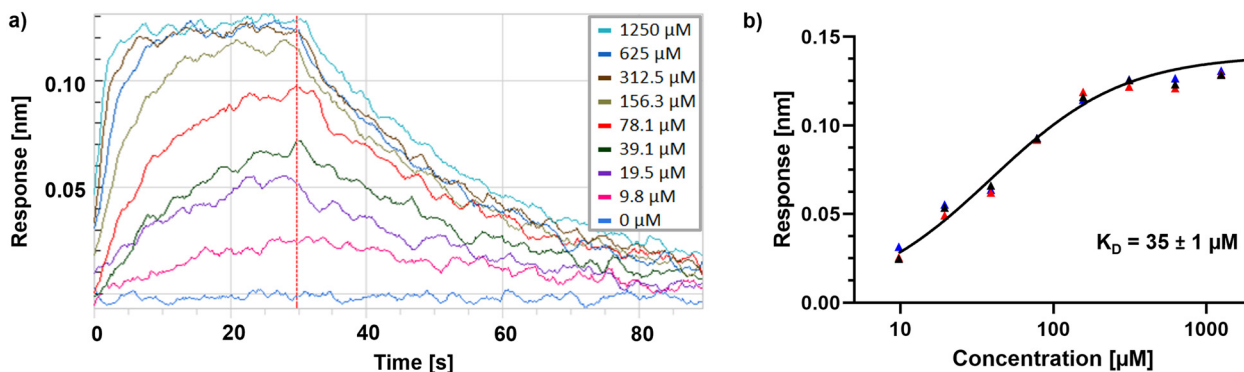
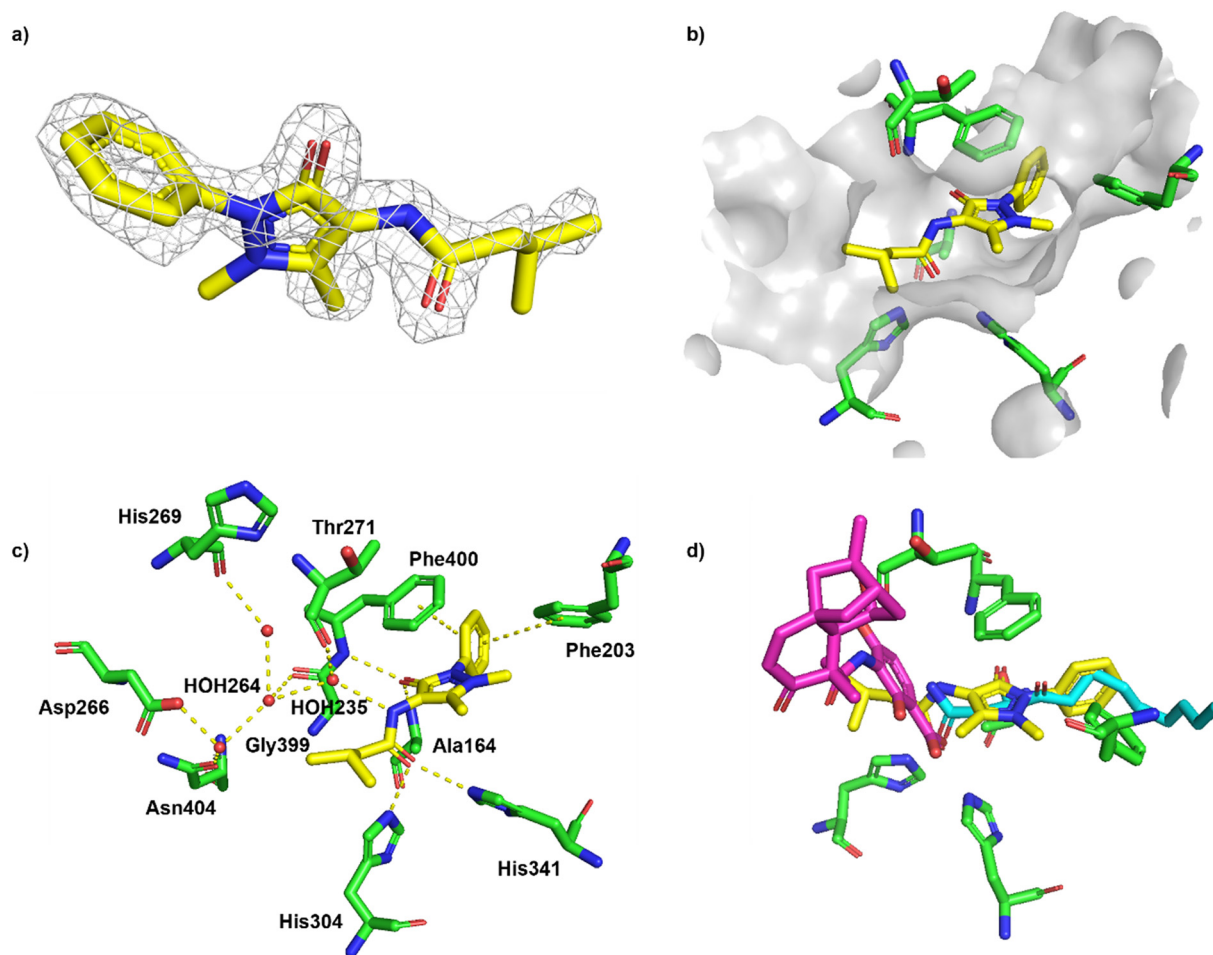


Fig. 5 a) BLI sensogram of fragment hit **1** binding to PaFabF C164A. The dashed red line indicates the start of the dissociation step. b) Steady-state plot fitted to the responses of three independent experiments using exclusively repurchased material of fragment hit **1**.







**Fig. 6** Binding of fragment hit 1 (EOS102727, yellow) to *PaFabF* C164A (PDB ID 8PJ0). a)  $|F_o - F_c|$  omit map of 1 binding to *PaFabF* C164A, contoured at 3.0 sigma. b) Solvent accessible surface using residues 4 Å from ligand 1. c) Interactions between 1 (yellow) and *PaFabF* C164A (green). Putative hydrogen bonds and  $\pi$ - $\pi$  interactions are displayed as yellow dotted lines. d) Binding modes of 1 overlaid with the binding modes of platensimycin (magenta), PDB ID 7OC1, and cerulenin (teal), PDB ID 4LS8.

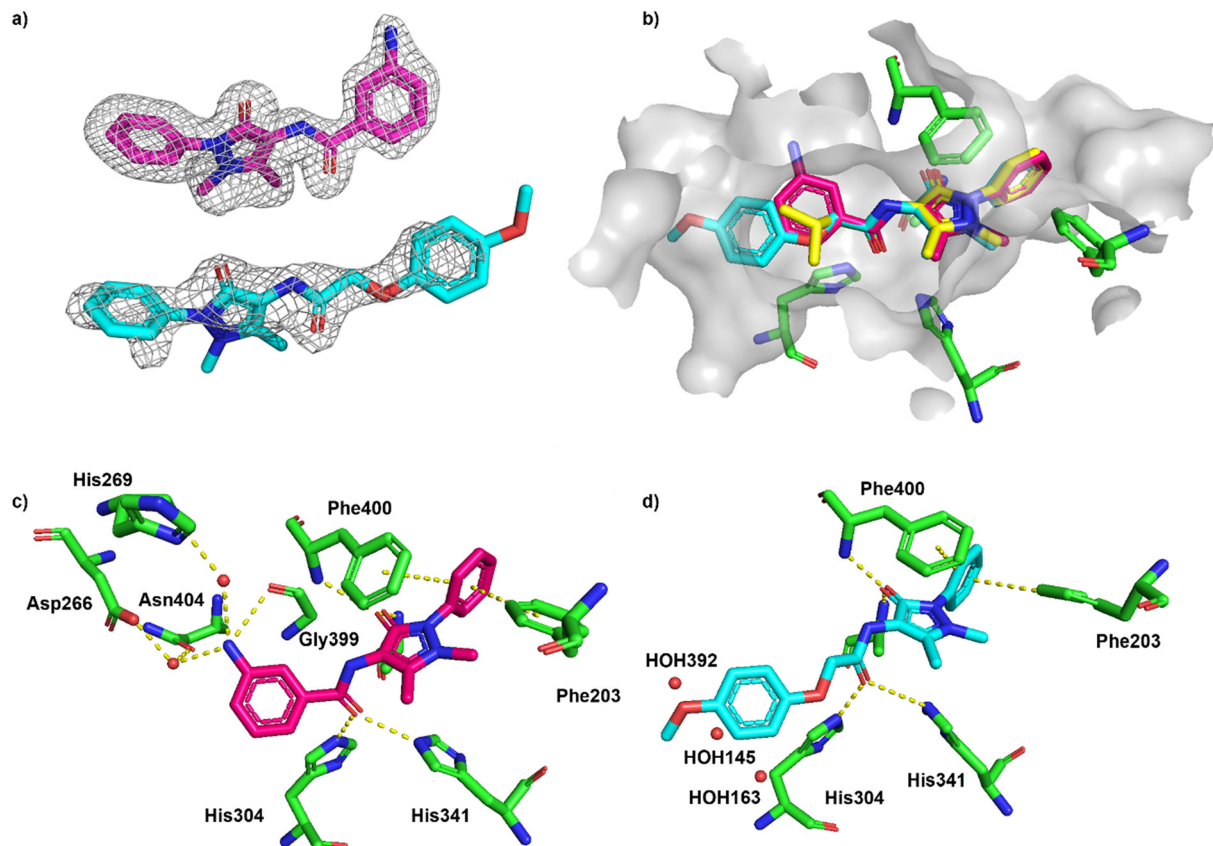
values below 100  $\mu\text{M}$  and showed selective binding to the C164A mutant (Table S3 and Fig. S3<sup>†</sup>). Four of them were found to have slightly more potent affinities than fragment hit 1.

Repurchased material for the two compounds that showed clean binding curves, hits 2 (EOS69423) and 3 (EOS21030), gave  $K_D$  values of 19 and 23  $\mu\text{M}$ , respectively (Table 3 and Fig. S4<sup>†</sup>).

**Table 3** Dissociation constants and ligand efficiency of EFSL hit 1 and ECBL compounds 2 and 3

#		<i>PaFabF</i> C164A $K_D$ [ $\mu\text{M}$ ]	Ligand efficiency [in kcal mol <sup>-1</sup> per heavy atom]
1		35 ± 1	0.29
2		19 ± 3	0.27
3		23 ± 2	0.23





**Fig. 7** Binding of ECBL compounds **2** and **3** to PaFabF C164A (PDB ID 8R0I and 8R1V, respectively). a)  $|F_o - F_c|$  omit map of **2** (top) and **3** (bottom) binding to PaFabF C164A contoured at 3.0 sigma. b) Alignment of binding modes of **1** (yellow), **2** (magenta) and **3** (cyan) together with solvent accessible surface of the binding site using residues 6 Å from ligand **3**. For clarity, only selected interacting residues from the complex PaFabF C164A-1 are shown (green). c) Interactions between **2** (magenta) and PaFabF C164A (green). Putative hydrogen bonds and  $\pi$ - $\pi$  interactions are displayed as yellow dotted lines. d) Binding mode of **3** (cyan) together with three water molecules that were found in the complexes with **1** and **2** but displaced by **3** (HOH392, 145 and 163, numbering from PaFabF C164A-1).

Ligand efficiencies (in kcal mol<sup>-1</sup> per heavy atom) for hits **2** and **3** are 0.27 and 0.23, respectively, slightly below the ligand efficiency for the original fragment hit **1** (0.29).

The cocrystal structures of compound **2** and **3** with FabF C164A were determined at 1.5 Å and 2.1 Å resolution, respectively (Fig. 7a). The binding modes of the phenyl-pyrazolone moieties of **2** and **3** were identical to the mode determined for hit **1** (Fig. 7b). The aniline group of **2** was placed in the same position and adopted the same interactions as a water molecule found in the structure of **1** (HOH264, Fig. 6c), namely a direct hydrogen bond to the carbonyl group of Gly399 and water-mediated hydrogen bonds to Asp266, His269 and Asn404 (Fig. 7c). The water molecule found to bridge the amide nitrogen of **1** to Thr271 (HOH325, Fig. 6c) was not present in the complex with **2**. Thus, the amide group of **2** lacked a hydrogen-bonding partner, which might explain the marginal affinity gain observed for **2** compared to **1**, despite **2** forming more extended hydrogen bonds with the receptor. In contrast, **3** did not form any additional hydrogen bonds with FabF C164A, but instead the anisoyl group extended deeper into the pocket and displaced three structural water molecules that were found in this area in the complexes with **1** and **2** (Fig. 7d).

## Conclusions

We have introduced a new library of 1056 chemical fragments (EFSL) that was purposely designed to facilitate follow-up fragment hit optimization activities through a direct substructural connection with a high-throughput screening library (ECBL) of almost 100 000 compounds from commercial vendors and academic partners of the EU-OS ERIC initiative. Both compound collections are openly accessible to the scientific community and examples of their use in screening campaigns, with a range of diverse screening technologies, have demonstrated the successful application in the identification of fragment hits for unconventional protein targets as well as in the fragment progressibility and generation of structure-activity relationships in fast follow-up activities. Besides performance assessments, the general use of EFSL in those screening campaigns provided valuable information on the current strengths, limitations and future improvements of EFSL. In addition, these insights will help us to gain a better understanding of the capacities of ECBL. We will strive to continue supporting worldwide efforts on chemical biology and drug discovery by aligning the expansion of both collections with the feedback received from an increasing number of users.



## Materials and methods

### NMR-based quality control of the EFSL

**Preparation of working stock 96-well plates.** From the 100 mM delivered stock solutions, 25  $\mu\text{L}$  were diluted with 25  $\mu\text{L}$  80%  $\text{d}_6\text{-DMSO}/20\%$   $\text{D}_2\text{O}$  to a final concentration of 50 mM. 25  $\mu\text{L}$  were transferred to a new 96-well plate. The 96-well plate was placed on a shaker and mixed for 10 min at 37  $^\circ\text{C}$ . Afterwards, the plate was briefly centrifuged and sealed with an adhesive foil. The original stock solutions were stored at  $-20$   $^\circ\text{C}$ , while the new transferred plates were stored at 4  $^\circ\text{C}$ .

**Preparation of samples and NMR tubes.** Taking out the 50 mM stock 96-well plates and placing them on a heated shaker at 37  $^\circ\text{C}$ , they were mixed for 20 min. After being briefly centrifuged, the adhesive foil was removed and 1  $\mu\text{L}$  of each fragment stock solution was pipetted into the corresponding 96-well on a new plate. Column 12 of each plate was filled with 80%  $\text{d}_6\text{-DMSO}/20\%$   $\text{D}_2\text{O}$ . The working stock 96-well plates were resealed and put back into the 4  $^\circ\text{C}$  fridge. 49  $\mu\text{L}$  of protein screening buffer/ $\text{d}_6\text{-DMSO}$  mixture were added to each fragment. The protein screening buffer consists of 25 mM NaPi, 150 mM NaCl, 5%  $\text{d}_6\text{-DMSO}$ , and 10  $\mu\text{M}$  DSS at pH 7.5. Each 96-well contains 1 mM fragment with 5%  $\text{d}_6\text{-DMSO}$  in protein screening buffer. All wells were thoroughly mixed with a multichannel pipette, sealed with adhesive foil, and briefly centrifuged. The 96-well plates were placed onto the robot tray and the pipetting robot transferred 40  $\mu\text{L}$  of each fragment into 1.7 mm NMR tubes. These were centrifuged, sealed, and placed into a 4  $^\circ\text{C}$  fridge until data acquisition. For the minifrag plate, a 10 mM fragment, 5%  $\text{d}_6\text{-DMSO}$  solution was prepared in protein screening buffer. 200  $\mu\text{L}$  final volume were transferred by the pipetting robot into 3 mm NMR tubes, centrifuged, sealed, and placed into a 4  $^\circ\text{C}$  fridge until data acquisition. For necessary remeasures of normal sized fragments, a 1 mM fragment, 5%  $\text{d}_6\text{-DMSO}$  solution was prepared in protein screening buffer and 200  $\mu\text{L}$  final volume were transferred by the pipetting robot into 3 mm NMR tubes, centrifuged, sealed, and placed into a 4  $^\circ\text{C}$  fridge until data acquisition.

**NMR measurement conditions.** All 1056 fragments were measured at the same 600 MHz spectrometer at 298 K. 781 Fragments were measured in 1.7 mm tubes, 275 fragments in 3 mm tubes. Using Bruker's Complete Molecular Confidence for quantification tool (CMCq), a 1H 1D spectrum was automatically acquired for all fragments and correlated with the corresponding chemical structure of each fragment.

**Automatic fragment characterisation using CMCA in Top-Spin.** All 1H 1D spectra were referenced on DMSO and using the "Batch Analysis" function of Bruker's CMC-assist (CMCA), each 96-well plate was automatically processed, and a consistency check conducted. Using these defined impurities, the automatic consistency check ran successful for all plates. This gave an initial impression for each fragment and categorised all into either "consistent" or "inconsistent".

**Expert review in CMCA.** To verify the automatic analysis, each fragment was assessed and carefully checked by a NMR

expert. Fragments that passed the automatic analysis as "consistent" were double checked to be indeed "consistent". This involved judging the multiplicity of the signals, their shape and ppm value compared to the prediction, and the sum of the integrals to be adding up with the number of protons. If the fragment stayed "consistent", it got labelled as "consistent expert" in CMCA, giving the option to show that each fragment was individually verified. In case the automatic analysis labelled a fragment "inconsistent", the reason for the inconsistency was noted down in the "Result Summary" for that fragment and the state changed to "inconsistent expert". The most common reasons for inconsistency were solubility issues (59% of all inconsistent), too many additional signals in either aliphatic or aromatic region (20%), or failure in water suppression (10%).

### BLI screening

The DNA sequence coding for PaFabF C164A was synthesized and cloned into pET-28a-TEV vectors by Genscript (New Jersey). The protein was purified and expressed using the same protocol as described for PaAviFabF C164A.<sup>37</sup> BLI measurements were performed using an Octet RED96 instrument (FortéBio) at a constant temperature of 298 K. Wells contained a total volume of 200  $\mu\text{L}$  liquid. The biotinylated proteins at a concentration of 500  $\mu\text{g mL}^{-1}$  in assay buffer [1 $\times$  PBS, 0.0001% (v/v) TritonX100, 5 mM DTT, 5% (v/v) DMSO] were immobilised onto super streptavidin (SSA) biosensors (FortéBio) as described earlier.<sup>36</sup> Fragment DMSO stocks were transferred to polypropylene 96-well F-Bottom microplates (Greiner Bio-One) using a Mosquito liquid handler and buffer was added to a final concentration of 500  $\mu\text{M}$  fragment in 1 $\times$  PBS, pH = 7.4, 0.0001% (v/v) TritonX100, 5 mM DTT, 5% (v/v) DMSO in all wells besides the outer ones (rows A, H and columns 1, 12) which only contained buffer. Binding of fragments to PaAviFabF C164A, PaAviFabF and w.t. and biocytin blocked reference sensors was measured one at the time by a series of sequential steps. The screening of each plate was initiated by a 300 s washing step of the sensors in buffer, followed by an alternating sequence of measuring 30 s baseline (buffer), 30 s association (fragment containing well) and 30 s dissociation (buffer) for all compound-containing wells. 12 plates containing a total of 1047 fragments were screened in this fashion, while a plate containing platencin at a concentration of 5  $\mu\text{M}$  was run after every fragment plate, serving as a positive control against the FabF C164A and negative control against the w.t. sensors. The average Z' factor calculated per plate was 0.41. The BLI responses were single-well referenced and imported into KNIME<sup>41</sup> (v. 4.3.1). To remove binders with strong response to the biocytin loaded reference sensors the mean single well referenced response of these single well referenced sensors was calculated, and the cut off was set to mean  $\pm$  1 STD. Fragments with a higher or lower response than this range were excluded from further analysis. Double referenced responses of the remaining fragments were obtained by subtracting the response of biocytin loaded





sensors from protein loaded sensors. These were averaged over all fragments per receptor (FabF w.t. or FabF C164A) and the hit threshold was set to mean + 1 STD. The hit lists for FabF C164A and FabF w.t. were joined and after visual inspection of the raw data, 74 compounds were progressed to 5 concentration dose–response follow-up ranging from 500 to 31.25  $\mu\text{M}$  using 1:1 dilution and an alternating sequence of 30 s baseline, 30 s association and 30 s dissociation steps. Double referencing against biocytin sensors were applied and the last 5 seconds of the association step was used to determine responses using the FortéBio software. 17 compounds gave a  $K_D$  lower than 2 mM against either FabF variant (Table S2 and Fig. S2†).

### Screening of ECBL compounds

Tanimoto similarities between fragment hit 1 and all compounds in the ECBL collection were calculated using radial fingerprints in Canvas (<https://www.schrodinger.com/training/canvas>). A threshold of 0.24 was chosen resulting in 147 compounds where all structures retained the phenylpyrazolone core scaffold. The set was screened as described above for fragments but a fragment compound concentration of 100  $\mu\text{M}$  and DMSO concentration of 1% was used. 12 compounds were advanced to a 10-concentration dose–response experiment ranging from 125 to 0.24  $\mu\text{M}$  in 1.25% DMSO.

### $K_D$ determination for compounds 1–3

$K_D$  values were determined as the average of three experiments using the last 5 seconds of the association step of FabF C164A responses double referenced against biocytin responses. Steady state plots were obtained using GraphPad (Fig. S2 and S3†). Reported errors are standard errors. The repurchased hits were measured as 8 concentration 1:1 dilutions ranging from 1250 to 9.77  $\mu\text{M}$  for hit 1, and 500 to 1.96  $\mu\text{M}$  for hit 2 and 3. Ligand efficiencies were calculated using  $LE = -RT \ln(K_D)/N$ , where  $T$  is 298.15 K,  $R$  is the gas constant 1.9872 cal  $\text{K}^{-1} \text{mol}^{-1}$  and  $N$  is the number of non-H atoms.<sup>7</sup>

### Chemical compounds

Fragment 1 was purchased from Crea-Chim UAB, whereas compounds 2 and 3 were purchased from Enamine Ltd and ChemBridge Corporation, respectively.

### X-ray crystallography of the fragment–protein complex

For ligand 1 purified *Pa*FabF C164A (9.2 mg  $\text{mL}^{-1}$ ) was mixed with well buffer (35% PEG 3350, 0.24 M ammonium formate) at 0.6:0.3  $\mu\text{L}$  drop ratio. For ligands 2 and 3 *Pa*FabF C164A (10 mg  $\text{mL}^{-1}$ ) was mixed with well buffer at 0.4:0.2  $\mu\text{L}$  drop ratio. Drops were let to equilibrate at 25 °C using the vapor diffusion, sitting drop technique. Crystals were observed within 12 hours and crystals growth continued for up to 2 days. For soaking of compound 1, 100 nL of ligand solution (50 mM in DMSO) was added in the crystal drop and let to equilibrate for a maximum of 30 minutes. For compound 2,

300 nL of ligand solution (10 mM in DMSO) was added to the drop and let to equilibrate for 30 minutes while for compound 3, crystals were dipped into the ligand solution (10 mM in DMSO) for 30 seconds. Soaked crystals were then fished and frozen in liquid nitrogen. X-ray data were collected at 100 K at the P11 beamline, DESY synchrotron radiation facility in Hamburg, Germany for ligand 1, and at the ESRF beamline ID30B for compounds 2 and 3. X-ray diffraction images were processed using the auto process pipelines provided by the beamline. Dimple<sup>42</sup> from the CCP4i2 suite<sup>43</sup> was used for molecular replacement using the PDB 4JB6 as input model. The modelled structures were manually inspected and corrected using Coot,<sup>44</sup> while ref. 45 was used for the refinement of the crystal structures (Table S4†). Atomic coordinates have been deposited in the PDB (8PJ0, 8R0I and 8R1V) and they will be released upon publication of the article.

### Accession codes

Coordinates and structure factors have been deposited at the PDB with the corresponding structure identification code: 8PJ0 (fragment hit 1), 8R0I (hit 2) and 8R1V (hit 3). The authors will release the atomic coordinates upon article publication.

### Abbreviations

ECBD	European Chemical Biology Database
ECBL	European Chemical Biology Library
EFSL	European Fragment Screening Library
ERIC	European Research Infrastructure Consortium
EU-OS	EU-OPENSCREEN
FBDD	Fragment-based drug discovery
HTS	High-throughput screening

### Author contributions

X. J., A. Z. and J. M. performed the cheminformatics analyses for library design. H. B., S. S., F. K., C. R., and H. S. obtained and analysed the NMR spectra for quality control. L. O. E. and V. Y. carried out the fragment screening against *Pa*FabF and *Pa*FabB. L. O. E. selected compounds for follow-up studies, performed binding assays, and drafted the section about the *Pa*FabF use case with input from C. G. and V. Y. C. G. and V. Y. carried out X-ray crystallography with *Pa*FabF, with input from L. O. E. E. S. formatted and provided the compounds of the EFSL and ECBL to all screening sites. T. M. and R. H. managed access from users. K. J. and A. J. performed the screening campaign against Nsp10/16 complex. P. G., H. S., R. B., A. J., A. Z., and J. M. conceived the project, guided the research, analysed all data and wrote the paper. X. J., H. B., and L. O. E. contributed equally to this work. All authors reviewed and approved the final version of the manuscript.



## Conflicts of interest

X. J. and J. M. are currently employees of the company Chemotargets, of which J. M. is co-founder and co-owner.

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