

Delft University of Technology

Surfing the wave of oxyfunctionalization chemistry by engineering fungal unspecific peroxygenases

Beltrán-Nogal, Alejandro; Sánchez-Moreno, Israel; Méndez-Sánchez, Daniel; Gómez de Santos, Patricia; Hollmann, Frank; Alcalde, Miguel

DOI 10.1016/j.sbi.2022.102342

Publication date

Document Version Final published version

Published in Current Opinion in Structural Biology

Citation (APA)

Beltrán-Nogal, A., Sánchez-Moreno, I., Méndez-Sánchez, D., Gómez de Santos, P., Hollmann, F., & Alcalde, M. (2022). Surfing the wave of oxyfunctionalization chemistry by engineering fungal unspecific peroxygenases. *Current Opinion in Structural Biology*, *73*, Article 102342. https://doi.org/10.1016/j.sbi.2022.102342

Important note

To cite this publication, please use the final published version (if applicable). Please check the document version above.

Copyright

Other than for strictly personal use, it is not permitted to download, forward or distribute the text or part of it, without the consent of the author(s) and/or copyright holder(s), unless the work is under an open content license such as Creative Commons.

Takedown policy

Please contact us and provide details if you believe this document breaches copyrights. We will remove access to the work immediately and investigate your claim. Available online at www.sciencedirect.com

ScienceDirect

Surfing the wave of oxyfunctionalization chemistry by engineering fungal unspecific peroxygenases



Alejandro Beltrán-Nogal¹, Israel Sánchez-Moreno¹, Daniel Méndez-Sánchez¹, Patricia Gómez de Santos², Frank Hollmann³ and Miguel Alcalde¹

Abstract

The selective insertion of oxygen into non-activated organic molecules has to date been considered of utmost importance to synthesize existing and next generation industrial chemicals or pharmaceuticals. In this respect, the minimal requirements and high activity of fungal unspecific peroxygenases (UPOs) situate them as the jewel in the crown of C-H oxyfunctionalization biocatalysts. Although their limited availability and development has hindered their incorporation into industry, the conjunction of directed evolution and computational design is approaching UPOs to practical applications. In this review, we will address the most recent advances in UPO engineering, both of the long and short UPO families, while discussing the future prospects in this fast-moving field of research.

Addresses

¹ Department of Biocatalysis, Institute of Catalysis, CSIC, Marie Curie 2, 28049 Cantoblanco, Madrid, Spain

EvoEnzyme S.L., Parque Científico de Madrid, 28049, Madrid

³ Department of Biotechnology, Delft University of Technology, Delft, the Netherlands

Corresponding author: Alcalde, Miguel (malcalde@icp.csic.es) 🥤 (Gómez de Santos P.), 🤎 (Hollmann F.), 🤎 (Alcalde M.)

Current Opinion in Structural Biology 2022, 73:102342

This review comes from a themed issue on Engineering and Design

Edited by Sarel J. Fleishman and Roy A. Mariuzza

For a complete overview see the Issue and the Editorial

Available online xxx

https://doi.org/10.1016/j.sbi.2022.102342

0959-440X/© 2022 The Author(s). Published by Elsevier Ltd. This is an open access article under the CC BY-NC-ND license (http:// creativecommons.org/licenses/by-nc-nd/4.0/).

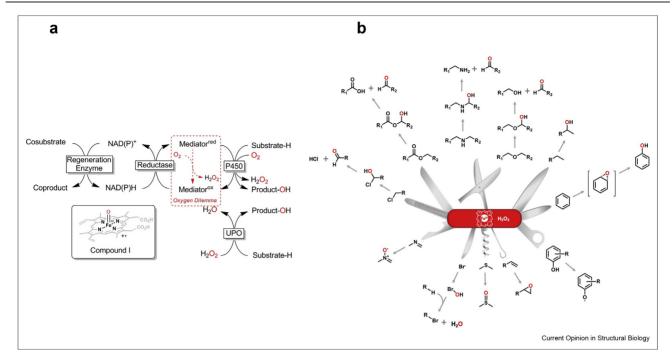
Introduction

The majority of industrialized countries are seeking new ways to produce the chemicals on which our society has based its existence, ways that consume less resources, generate less waste and that are economically feasible. One particular chemical transformation that appears to be of paramount interest is the selective oxyfunctionalization of non-activated C-H bonds, which is still a mere pipedream in industrial biocatalysis. Indeed, combining high reactivity with high selectivity remains the main stumbling block for chemical catalysis, although enzymes seem to be 'naturally sculpted' to manage this balancing act.

For several decades now, cytochrome P450 monooxygenases (in short P450s) have been the main focus of attempts to discover scalable reaction schemes, particularly given that oxyfunctionalization chemistry would benefit enormously from milder and more selective approaches [1,2]. Despite the Nobel prize winning developments of Frances H. Arnold and other pioneers in the field of protein engineering [3], P450s are still inefficient and not sufficiently robust to employ in large-scale production. The failure to take advantage of these enzymes is largely due to their catalytic mechanism involving reductive activation of molecular oxygen and the resulting need for complex and vulnerable electron transport chains in which a significant portion of reducing equivalents provided by NAD(P)H deviate in unproductive oxidative uncoupling and generation of reactive oxygen species [4], Figure 1a. In recent years, a new superfamily of heme-thiolate mono(per)oxygenases has emerged, the fungal unspecific peroxygenase group (UPOs, EC 1.11.2.1), that is made up of stable, extracellular enzymes that do not suffer the drawbacks of P450s, while they do behave as self-sufficient biocatalysts in the most complex oxyfunctionalization reactions, Figure 1b [5-8].

Also due to the highly simplified regeneration scheme, UPO reactions, compared to P450 pendants, are much easier to control and optimize. As a result, while the catalytic performance of P450s still tends to range between several thousand and ten thousand catalytic turnovers, UPOs easily reach hundred thousand catalytic turnovers and probably more, suggesting they may soon offer better economic viability and even application for bulk chemical synthesis coming into reach [9-11]. Indeed, UPOs exhibit a remarkable industrial potential considering the steady increment of publications and patents relating UPOs and uses thereof over the last three years compared with the five previous years (from 10 to 24 publications and patents on average per year),





UPO catalytic advantages and portfolio of reactions. (a) Comparison of the molecular regeneration of P450 monooxygenases (upper) and UPOs (lower, right). Both enzyme classes utilize the same Compound I for oxygen-transfer reactions (lower, left), yet a much simpler mechanism of generation is used by peroxygenases. Furthermore, the reduced mediators in the mechanism used by P450 also directly react with O₂, thereby uncoupling the regeneration reaction from the oxyfunctionalization reaction and thus, limiting the efficiency of the overall reaction (Oxygen Dilemma). (b) The *swiss army knife*: As a result of the studies carried out since its discovery in 2004, and with nearly 400 substrates tested, UPO is now considered beyond doubt a swiss-army knife in oxyfunctionalization chemistry. Triggered simply by H₂O₂, which serves as the final electron acceptor and oxygen source, the promiscuity of UPOs is reflected by the huge portfolio of transformations they can perform, including aromatic, alkylic, (cyclo)aliphatic and heterocyclic hydroxylations, aromatic and aliphatic olefin epoxidations, ether cleavages (*O*-dealkylations), *N*-dealkylations, sulfoxidations, *N*-oxidations, deacylations (C–X bond cleavages) and halide oxidations/halogenations [5,9].

with a plethora of substrates and in reactions of commercial relevance. In this regard, enzyme engineering by directed evolution (i.e. iterative rounds of random mutation, DNA recombination and artificial selection) has proved to be a powerful strategy to obtain more efficient UPOs, adjusting exogenous genes to the subtleties of expression in a heterologous host, while opening up their full biocatalytic potential [8]. Most UPOs described to date may need to be engineered to meet the standards of a robust industrial biocatalyst, including high levels of heterologous functional expression, high stability under operational conditions -in terms of pH, temperature and the presence of non-aqueous media-, as well as the modification of chemo-, regio- and enantioselectivities. Besides, the unwanted peroxidative activity, the oxidative inactivation by H₂O₂ and the product overoxidation, are intrinsic UPOs' problems that deserve further research.

The natural function and distribution of UPOs, their mechanism of action, the palette of chemical reactions and biotechnological applications, have all been described extensively in recent years, and the reader is

recent findings in the field of UPO engineering, highlighting some relevant case studies involving the short and long UPO families (Figure 2), as well as offering a glimpse of the significant work carried out on artificial peroxygenases. In addition, we will share our perspectives for the present and future development of this promising area of research.

referred to other excellent reviews addressing these

topics [5-10,12-17]. We will focus here on the most

The engineering of long UPOs

In general terms, long UPOs are poorly expressed in heterologous hosts [10,18]. The lack of specific chaperones, the need for complex post-translational modifications (N- and/or C-terminal processing, the formation of S–S bridges, glycosylation) and the singularity of being heme-thiolate enzymes (*i.e.* carrying a cysteine residue as the axial [fifth] ligand of the iron-heme prosthetic group), along with harbouring a structural Mg²⁺ cation, are all important hurdles to be overcome for the successful functional expression of these enzymes. However, these drawbacks are currently being

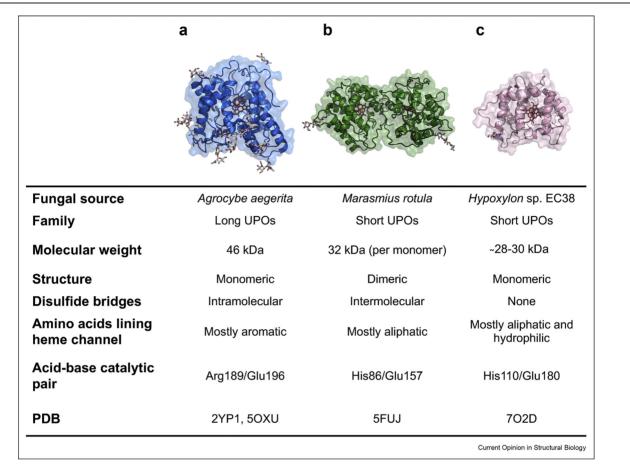


Figure 2

Short and long UPOs. Up to date, all UPO genes have been exclusively found in the fungal kingdom, yet their natural functions are unclear. For instance, in the ligninolytic enzyme consortium secreted by white-rot fungi, which is formed by high-redox potential oxidoreductases (including laccases, peroxidases and H₂O₂ supplying enzymes [17]), UPOs may be involved in the latest stage of lignin degradation (*e.g. O*-demethylation), showing also potential roles as an 'external detoxifying agent' or in the synthesis of different metabolites, including antibiotics. As several UPO genes have been reported in selective white-rot fungi, their potential action during natural wood decay may expand their biotechnological applications beyond organic synthesis, including uses in the bioremediation of different pollutants in the near future. From a phylogenetic point of view, UPOs are sorted in two broad families, short and long UPOs that show different molecular sizes and structural organization. Despite both UPO families have highly conserved sequences at the active site (EGD-S-R-E for long UPOs and EHD-S-E for short UPOs), they show distinct active site shapes and reactivities that are responsible for different substrate profiles and product selectivity [7,12]. In general terms, short UPOs can transform bulky compounds (including steroids and long aliphatic substrates) while long UPOs have stronger preferences towards small aromatic compounds. Crystal structures of long UPO (*Aae*UPO (**a**)) and short UPOs (*Mro*UPO (**b**) and *Hsp*UPO (**c**)) are shown together with their general characteristics.

tackled by protein and/or strain engineering, Table 1, Figure 3. The first true heme-thiolate peroxygenase reported came from the edible mushroom Agrocybe aegerita (AaeUPO), which was also the first UPO to be engineered in the laboratory, becoming a platform for peroxygenase chemistry. This enzyme was subjected to directed evolution to improve its functional expression in yeast (both Saccharomyces cerevisiae and Pichia pastoris/ Komagataella phaffii), giving rise to the PaDa-I mutant that is expressed at ~ 8 mg/L in S. cerevisiae and over 200 mg/L in P. pastoris in a bioreactor [19,20]. Since then, PaDa-I has become a recurrent example in UPO engineering, not only working as a launching pad for multiple applications and the generation of new mutants but also, providing important lessons for the functional expression of other novel UPOs, from the pivotal role of bearing a proper signal peptide to drive secretion and adopting expression mutations, to its use for UPO chimeragenesis (vide infra). The first pilot-scale production of PaDa-I was reported recently in a 2500 L fermentation of P. pastoris, paving the way for its transfer to industry [21]. More significantly, recent evolutionary campaigns of PaDa-I in conjunction with computational studies, such as ligand diffusion and QM/MM simulations, identified the JaWa and SoLo mutants to be highly active and regioselective for the production of aromatic compounds, in particular the agrochemical 1-naphthol and several human drug metabolites (HDMs)

4
Engineering
g and
Design

Recombinant and genetically engineered UPOs.									
Parental type ^a	Family	Variant	Expression host ^b	Engineering method	Relevant achievements	Ref			
AaeUPO	Long	PaDa-I mutant ^c	S. cerevisiae/P. pastoris	Random mutagenesis, <i>in vivo</i> shuffling and signal peptide engineering by MORPHING ^e	Functional expression, improved activity and stability; general platform for UPO engineering	[19,20]			
<i>Aae</i> UPO PaDa-I mutant	Long Long	Recombinant ^d JaWa mutant	M. oryzae S. cerevisiae/P. pastoris	Fusion to <i>M. oryzae</i> signal peptide Random mutagenesis, <i>in vivo</i> shuffling, StEP ^f	Functional expression Improved synthesis of 1-naphthol with high regioselectivity and reduced peroxidative activity	[59] [22]			
PaDa-I mutant	Long	WamPa mutant	S. cerevisiae/P. pastoris	Random mutagenesis, <i>in vivo</i> shuffling, neutral genetic drift, site directed recombination <i>in vivo</i>	Improved activity in organic co- solvents	[28,29]			
PaDa-I mutant	Long	JEd-I mutant	S. cerevisiae/P. pastoris	Site saturation mutagenesis	Improved kinetic parameters for peroxidative and peroxygenative substrates; high resolution crystal structures unveiled the pattern of substrate binding.	[26]			
PaDa-I mutant	Long	Clones 8 and 23	S. cerevisiae/P. pastoris	Combinatorial site saturation mutagenesis	Determination of the origin for peroxidative activity in long UPOs	[33]			
PaDa-I, <i>Gma</i> UPO, <i>Cci</i> UPO	Long	Chimeras I-VI	S. cerevisiae	Combinatorial Golden Gate cloning	High-throughput GC–MS method to detect activity against tetralin; first reported UPO chimeras	[27]			
JaWa mutant	Long	SoLo mutant	S. cerevisiae/P. pastoris	MORPHING ^e and combinatorial mutagenesis	Improved synthesis of HDMs ^g with high regioselectivity	[23,24]			
SoLo mutant	Long	SoLo-AAO fusion	S. cerevisiae/P. pastoris	UPO_AAO Enzyme fusion libraries with peptide linkers and leaders	Self-sufficient UPO system for the synthesis of HDMs ⁹	[25]			
PabUPO-I	Long	Grogu mutant	S. cerevisiae/P. pastoris	Adopting secretion mutations by site directed recombination <i>in vivo</i> and signal peptide switching	Functional expression and unusually broad pH stability and activity profiles	[30]			
PabUPO-II	Long	Recombinant ^d	S. cerevisiae/P. pastoris	Signal peptide switching	Functional expression and unusually broad pH stability and activity profiles	[30]			
PabUPO-I, <i>Cg</i> IUPO	Long and short	Recombinant ^d	E. coli	Fusion proteins with SUMO (Small Ubiquitin-related MOdifier) and TRX (thioredoxin)	Functional expression	[40]			
PaDa-I, short and long evolved UPO variants	Long and Short	12 Evolved UPO variants (EVOkit)	P. pastoris	EvoShuffler	Evolved UPOs by EvoEnzyme, S.L.; uses in lead diversification, HDMs synthesis, production of fine chemicals	https://evoenzyme.com			
<i>Cci</i> UPO	Long	Recombinant ^d	Aspergillus oryzae	n.d.	Recombinant peroxygenase by Novozymes A/S	[13]			
HinUPO	Short	Recombinant ^d	Aspergillus oryzae	n.d.	Recombinant peroxygenase by Novozymes A/S	[13]			
<i>Hsp</i> UPO	Short	Recombinant ^d	P. pastoris	Attachment to a mating-factor secretion sequence, use of a hyper secretory <i>P. pastoris</i> strain	Functional expression, biochemical characterization, crystallization with different ligands	[34]			

<i>Mro</i> UPO	Short	Recombinant ^d	S. cerevisiae/P. pastoris	Signal-peptide shuffling	Functional expression; Modular Golden Gate-based UPO secretion system	[36]
<i>Mro</i> UPO	Short	I153T and I153F–S156F mutants	E. coli	Site-directed mutagenesis	Modulated epoxidation vs. hydroxylation selectivity in fatty acids	[39]
<i>Cgl</i> UPO	Short	Recombinant ^d	S. cerevisiae/P. pastoris	Signal-peptide shuffling	Functional expression. Modular Golden Gate-based UPO secretion system	[36]
<i>Mth</i> UPO	Short	Recombinant ^d	S. cerevisiae/P. pastoris	Signal-peptide shuffling	Functional expression. Modular Golden Gate-based UPO secretion system	[36,37]
MthUPO	Short	L60F, F59Q- L60F-S159G and L60F-S159G- A161F mutants	S. cerevisiae	Site-saturation mutagenesis	Chemo- and regioselective oxidations of benzylic and aromatic compounds	[43]
<i>Mth</i> UPO	Short	L60A, F154V and A161L mutants	S. cerevisiae	Site-saturation mutagenesis	Selective alkene epoxidation and shifted regioselectivities towards the synthesis of 2- and 1-octanol	[44]
<i>Tte</i> UPO	Short	Recombinant ^d	S. cerevisiae/P. pastoris	signal peptide shuffling	Functional expression; modular Golden Gate-based UPO secretion system	[36,37]
<i>Mhi</i> UPO	Short	Recombinant ^d	P. pastoris	Promoter/signal peptide shuffling	Functional expression; episomal expression system for directed UPO evolution in <i>P. pastoris</i>	[37]
<i>Mfe</i> UPO	Short	Recombinant ^d	P. pastoris	Promoter/signal peptide shuffling	Functional expression; episomal expression system for directed UPO evolution in <i>P. pastoris</i>	[37]
<i>Dca</i> UPO	Short	Recombinant ^d	P. pastoris	Promoter-signal peptide shuffling	Functional expression, episomal expression system for directed UPO evolution in <i>P. pastoris</i>	[37]
<i>Dca</i> UPO	Short	Recombinant ^d	E. coli	None	Functional expression	[38]
<i>Cvi</i> UPO	Short	Recombinant ^d	E. coli	None	Functional expression	[38]
<i>Cvi</i> UPO	Short	F88L and T158F mutants	E. coli	Site-directed mutagenesis	Selective oxidation of unsaturated fatty acids of different chain lengths	[42]

^a AaeUPO, UPO from Agrocybe aegerita; GmaUPO, UPO from Galerina marginata; CciUPO, UPO from Coprinopsis cinerea; PabUPO-I, UPO paralog from Psathyrella aberdarensis; PabUPO-II, UPO paralog from Psathyrella aberdarensis; Cg/UPO, UPO from Chaetomium globosum; HinUPO, UPO from Humicola insoles; HspUPO, UPO from Hypoxylon sp. EC38; MroUPO, UPO from Marasmius rotula; MthUPO, UPO from Myceliophthora thermophila; TteUPO, UPO from Thielavia terrestris; MhiUPO, UPO from Myceliophthora hinnulea; MfeUPO, UPO from Myceliophthora fergusii; DcaUPO, UPO from Daldinia caldariorum; CviUPO, UPO from Collariella virescens.

^b S. cerevisiae, Saccharomyces cerevisiae; P. pastoris, Pichia pastoris; M. oryzae, Magnaporthe oryzae; A. oryzae, Aspergillus oryzae; E. coli, Escherichia coli.

^c PaDa-I mutant is also referred in many studies as to rAaeUPO.

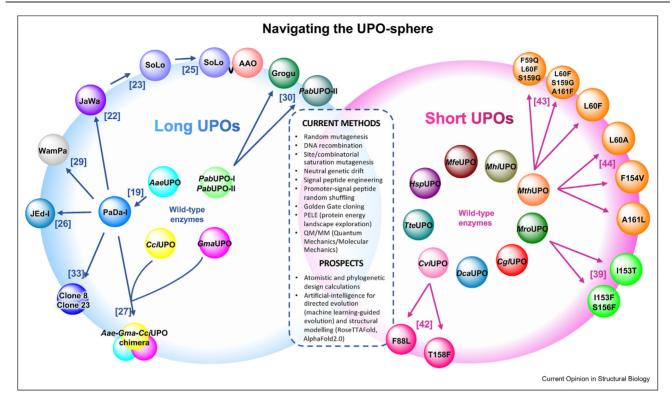
^d Recombinant: native (non-mutated) enzyme expressed in a heterologous host.

^e MORPHING (Mutagenic Organized Recombination Process by Homologous IN vivo Grouping).

^f StEP (Staggered Extension Process).

^g HDMs (Human Drug Metabolites); n.d. not described.





Navigating the UPO sphere. With more than 4000 UPO sequences deposited in genomic databases, the number of recombinant UPOs produced and engineered in the laboratory is steadily increasing. Indeed, directed evolution is shifting the paradigm of adapting processes to the UPO available, to adapting the UPO to a given process. Such an approach is expanding the application of UPOs to a larger number of new reactions and positioning them, little by little, in a privileged position to compete with standard chemical catalysts [8,9]. On the left are the recombinant long UPOs expressed and the variants engineered in recent years, whereas an analogous diagram of their short family counterparts is shown on the right. Current engineering methods and future trends are highlighted in the central box. In brackets are shown the associated references (see also Table 1).

[22-24]. The latter are of considerable interest to the pharmaceutical industry, as the synthesis of HDMs on a preparative scale is a fundamental part of the pharmaceutical manufacturing pipeline and a new offspring of UPO mutants has just been commercially available, Table 1. The potential use of the SoLo mutant has been further explored by creating a chimeric fusion with an evolved aryl alcohol oxidase (AAO) that acts as a H_2O_2 supplier [25]. One of the benefits of this UPO AAO fusion is that the AAO partner feeds the UPO partner in situ, providing controlled and stochiometric amounts of H₂O₂ that limit UPO oxidative inactivation. This inactivation is a mechanistic problem known as suicide inactivation, whereby H2O2 is the enzyme's cosubstrate but paradoxically, it is also a strong inhibitor of its activity. Indeed, the rate of H₂O₂ feeding in peroxygenase driven reactions has been explored in depth over recent years through photo-, chemo- electroand biocatalysis (*i.e.* enzyme cascade reactions) [12 and references therein]. However, bringing the two active sites close together in a single polypeptide seems to generate a substrate tunnelling effect that boosts the efficiency of oxyfunctionalization reactions [25].

The possibility of obtaining functional chimeric UPOs by assembling UPO blocks from different species has also generated interest. The sequences of PaDa-I, Galerina marginata UPO (GmaUPO) and Coprinopsis cinerea UPO (CciUPO), with more than 60% identity between them, were rationally split on the basis of PaDa-I crystal structure [26], giving rise to five subunits of secondary structural elements that could be randomly shuffled. The library of chimeric UPOs generated in this way was screened for the hydroxylation of tetralin using a multiple injection GC-MS high-throughput screening (HTS) assay [27]. Only four of the 243 chimeric possibilities were active with tetralin, with an overrepresentation of the PaDa-I sequence blocks in the structure of the selected functional chimeras. Future endeavours in this direction should perhaps focus on creating more complex sets of UPO chimeras, with less bias towards the PaDa-I mutant, such that new hybrid properties may arise among the variants.

In addition, the PaDa-I mutant has recently been used as a template to generate a palette of different mutants using diverse library creation methods, in particular by

neutral genetic drift (an engineering strategy based on accumulating neutral mutations that produce similar phenotypes with different genotypes) and classic in vivo DNA shuffling. In this way, a collection of neutrally evolved mutants with improved stability against temperature and the presence of co-solvents has been generated [28]. These variants were then further evolved toward a final mutant that is active and stable in the presence of high concentrations of organic solvents of different chemical nature and polarities, which can therefore be used in transformations of many hydrophobic compounds [29]. The activity and stability of this mutant, referred to as WamPa, was enhanced in the presence of acetonitrile, acetone, dimethyl sulfoxide and methanol. Significantly, the mutations were filtered by site directed recombination to achieve optimum epistasis, and they were mostly situated at the protein's surface and in the neighbourhood of the heme access channel.

It is worth noting that PaDa-I has also helped us to understand the determinants underlying the functional expression and activity of other UPOs. Very recently, two unusual acidic UPO paralogs from the East African ink-cap Candolleomyces (*Psathyrella*) aberdarensis (PabUPO) were engineered, adopting the evolved signal peptide from PaDa-I alongside many of the mature PaDa-I mutations that foster secretion by yeast [30]. Both PabUPO genes were satisfactorily expressed in yeast, producing 300 mg/L in a bioreactor together with the highest volumetric activity ever reported for a native or recombinant peroxygenase (60,000 U/L, using veratryl alcohol as a substrate). Of particular interest is the use of proper signal peptides that can guide the nascent UPO polypeptide through the secretory route of the eukaryotic host for a successful exocytosis. Most of the cases describing the heterologous expression of ligninolytic enzymes in yeast are based on the use of the a-factor prepro-leader from S. cerevisiae or chimeric evolved versions that help improve secretion yields. By contrast, all UPOs expressed to date show preferences for native signal peptides which can be switched among different species (vide infra) or that can be adapted to the particularities of the secretion route of the host by laboratory evolution, like in the case of the PaDa-I and the PabUPO paralogs.

While functional heterologous expression and oxidative stability are areas that have received much attention, the coexistence of peroxidative and peroxygenative activities in UPOs is also an important trait worthy of further study [31]. Conceptually, UPOs are considered hybrid enzymes of generic peroxidases and P450s, as they can perform both one electron oxidation of phenolics (peroxidative activity) and two electron oxidation reactions (*i.e.* oxygen insertions into organic compounds through their peroxygenative activity). Unfortunately, the convergence of both these activities within the same

protein scaffold makes UPOs unsuited to several industrial applications, since the product of this peroxvgenative activity may be a substrate for its peroxidative activity. Thus, this dual activity can severely affect final production yields and complicate downstream processes. Modifications to the heme access channel can affect the relative peroxygenative/peroxidative activities [22,24,31,32]. The origin of UPO's peroxidative activity has been isolated by combining computational simulations with saturation mutagenesis, highlighting a flexible loop at the heme funnel as the main region responsible for this activity. In turn, the influence of potential long-range electron transfer (LRET) pathways was ruled out, being these typical of ligninolytic peroxidases in which catalytic aromatic Trp/Tyr residues at the protein surface are connected to the heme by LRET [33]. Future engineering undertakings to improve specific reactions involving aromatic compounds should focus on dampening the peroxidative activity of UPO via the heme access channel while retaining and even improving its peroxygenative activity. Rather than engineering a universal UPO with quenched peroxidative activity, we visualize an ensemble of mutants created \hat{a} *la carte* for each specific reaction, particularly given that the relationship between both activities is dependent of the starting substrate.

The engineering of short UPOs

Although long UPOs have been those predominantly subjected to protein engineering over the past few years, they are gradually sharing this stage with their short UPO counterparts, Table 1, Figure 3. Unlike long UPOs, the heterologous expression of short UPOs is considerably easier and through different engineering approaches numerous recombinant enzymes of this family have been functionally expressed in heterologous hosts, mainly yeast. Very recently, the short UPO from Hypoxylon sp. EC38 (HspUPO) was cloned and functionally expressed in *P. pastoris*. This *Hsp*UPO was preceded by a mating-factor secretion sequence that drives protein secretion at titres of 200 mg/L in a bioreactor, allowing it to be characterized thoroughly at the biochemical and structural level. HspUPO was the fourth UPO successfully crystallized, together with wild-type AaeUPO, its evolved mutant PaDa-I, and the wild type short UPO from Marasmius rotula (MroUPO) [26,34,35]. In addition, four new recombinant short UPOs (MroUPO, UPO from Chaetomium globosum (Cg/UPO), UPO from Myceliophthora thermophila (MthUPO), and UPO from Thielavia terrestris (TteUPO)), have been expressed in S. cerevisiae and P. pastoris. Their heterologous expression was achieved by developing a modular shuffling system based on the Golden Gate cloning tool, whereby 17 different signal peptides were fused in a combinatorial way to eight different UPO sequences to identify the constructs most efficiently expressed by split-GFP (green fluorescent protein) screening [36]. Interestingly, using the same combinatorial fusion approach, 17 signal peptides and 11 different promoters were evaluated to find the optimal combination for the functional expression of other short UPOs by *P. pastoris* (Myceliophthora hinnulea (MhiUPO), Myceliophthora fergusii (MfeUPO) and Daldinia caldariorum (DcaUPO)), while introducing an episomal expression system for the directed UPO evolution in P. pastoris [37]. Expression of short UPOs in Escherichia coli as a host has been also reported for MroUPO, DcaUPO and Collariella (Chaetomium) virescens (CviUPO) although at considerably lower levels [38,39]. The lack of a well-developed secretory apparatus in E. coli seems to affect recombinant UPO production in this host. New approaches to resolve this problem include the use of SUMO (Small Ubiquitinrelated Modifier) and TRX (thioredoxin) fusion proteins to prevent their accumulation in inclusion bodies, and to enhance their solubility and stability, as recently reported with Cg/UPO [40].

As a rising number of new short UPOs are heterologously expressed, they are being engineered with more strict control of their regio-, enantio- and chemoselectivity. The *Mro*UPO expressed in *E. coli* has been rationally designed for the selective oxyfunctionalization of unsaturated fatty acids (oleic, linoleic and α -linoleic acids): Relevant catalytic residues at the entrance of the substrate channel were mapped by computational simulation and single/double mutants were identified that differed in their epoxidation/hydroxylation ratios, while also displaying improved regio- and chemoselectivities [39,41]. A similar approach was followed to design a double mutant of *Cvi*UPO expressed in *E. coli* in order to mimic the active site of the homologous *Cgl*UPO, acquiring analogous selectivity [42].

The *Mth*UPO expressed in yeast was studied by molecular dynamics simulations, assigning 9 positions at the entrance of the active site that were relevant for the chemoselective oxidation of naphthalene-derivative compounds [43]. After saturation mutagenesis and screening, single and double mutants with increased regio- and chemoselectivities were identified. Those mutant variants were benchmarked with octane, cyclohexane and cyclohexene as substrates, observing distinct patterns of oxidation and/or epoxidation depending on the variant assayed. This finding is not unexpected if we take into account that the variants were screened with a very different substrate, which ultimately highlights the first law of directed evolution, *i.e.* 'you get what you screen for' [44].

Artificial peroxygenases and *de novo* peroxygenase design

An interesting alternative to the design of natural UPOs, is the use of artificial enzymes that are capable of catalysing peroxygenase or peroxygenase-like activities [14]. Two lines of research have been followed in this regard: (i) opening up the catalytic repertoire of promiscuous, non-peroxygenase enzymes through engineering so that they can make use of peroxide to catalyse C-H oxyfunctionalizations; and (ii) the development of de novo peroxygenases from different computationally designed scaffolds (protein and non-protein based). In terms of the former, some P450 mutants can harness a peroxide shunt pathway to work like peroxygenases, although much less efficiently than natural UPOs [45,46]. It was recently demonstrated that P450 BM-3 from Bacillus megaterium can be converted into a peroxvgenase by simply adding a decoy molecule (N-(ω imidazolyl)-hexanoyl-L-phenylalanine) that mimics the active site of AaeUPO for the hydroxylation of small organic compounds [47]. Another enzyme that has shown mild promiscuous peroxygenase activity is the cofactor-independent 4-oxalocrotonate tautomerase (4-OT) from Pseudomonas putida. Engineered 4-OT variants were screened for enantioselective epoxidation of α , β -unsaturated aldehydes using H₂O₂ or *t*-BuOOH as oxidants. This approach led to the discovery of a triple mutant with a 60-fold enhancement in activity [48].

The *de novo* design of peroxygenases has focused on the use of metalloporphyrin-containing proteins (mimochromes) as protein scaffolds. Mimochromes are based on the miniaturization of the active site of human haemoglobin, mimicking the two parallel α -helices involved in metalloporphyrin binding. These artificial metalloenzymes can act as peroxygenases, catalysing the sulfoxidation of phenyl thioethers [49], as well as the selective oxidation of indoles [50]. Following a similar approach, the TM1459 cupin superfamily protein from Thermotoga maritima, a promiscuous metal-binding enzyme, was used as the departure point to design an osmium peroxygenase capable of dihydroxylating different alkenes [51]. Non-protein scaffolds, like G-quartet based systems, have been explored to construct DNAzymes capable of binding heme groups that catalyse peroxidase-like reactions, such as thioether oxidation [52].

Conclusions and future directions

We envisage a bright future for the engineering of UPOs in the quest for new functionalities, activities and selectivities. Leaded by the appearance of artificial intelligence (AI) algorithms to more accurately predict protein structure (DeepMind's AlphaFold2.0, RoseT-TAFold), exciting possibilities for UPO design will be unlocked in the forthcoming years at the time that experimental effort will be reduced by performing a more efficient structure-guided evolution [53,54]. With the number and accuracy of the prediction algorithms increasing rapidly, the nascent association between Rosetta design and phylogenetic inference methods will unfold the true potential of UPOs as synthetic tools [55]. We also foresee the use of paleoenzymology *-i.e.* ancestral sequence reconstruction and resurrectionaimed at opening unexplored avenues for the laboratory evolution of more promiscuous and stable ancestral UPOs [56]. This engineering tool-box will be completed in the near future with the arise of machine-learningguided directed evolution [57,58]. Taken together, the courtship of cutting-edge directed evolution and computational design should forge a breakthrough in organic chemistry, producing *ad-hoc* peroxygenases that will catalyse unprecedented chemical reactions in a manner that has not been seen to date.

Conflict of interest statement

Nothing to declare.

Acknowledgements

This work was supported by the Comunidad de Madrid Synergy CAM Project Y2018/BIO-4738-EVOCHIMERA-CM, the I+D+i PID2019-106166RB-100-OXYWAVE spanish project funded by the Ministerio de Ciencia e Innovación/Agencia Estatal de Investigación/ AEI/doi: 10.13039/ 501100011033/, the CSIC Project PIE-201580E042 and the Bio Based Industries Joint Undertaking under the European Union's Horizon 2020 Research and Innovation program (Grant Agreement No.: 886567, BIZENTE project). We also thank the Ministry of Science and Innovation for PGS's funding as part of PTQ2020-011037 project funded by MCIN/ AEI/10.13039/501100011033 within the NextGenerationEU/PRTR. A. Beltrán-Nogal thanks the Ministry of Universities (Spain) for his FPU fellowship (FPU20/01380).

References

Papers of particular interest, published within the period of review, have been highlighted as:

- * of special interest
- ** of outstanding interest
- Frey R, Hayashi T, Buller RM: Directed evolution of carbon-hydrogen bond activating enzymes. Curr Opin Biotechnol 2019, 60:29–38.
- Zhang RK, Huang X, Arnold FH: Selective C-H bond functionalization with engineered heme proteins: new tools to generate complexity. Curr Opin Chem Biol 2019, 49:67–75.
- Arnold FH: Directed evolution: bringing new chemistry to life. Angew Chem Int Ed 2018, 57:4143–4148.
- Holtmann D, Hollmann F: The oxygen Dilemma: a severe challenge for the application of monooxygenases? Chembiochem 2016, 17:1391–1398.
- Hofrichter M, Ullrich R: Oxidations catalyzed by fungal peroxygenases. Curr Opin Chem Biol 2014, 19:116–125.
- Hofrichter M, Kellner H, Pecyna MJ, Ullrich R: Fungal unspecific peroxygenases: heme-thiolate proteins that combine peroxidase and cytochrome P450 properties. USA. In *Monooxygenase,* peroxidase and peroxygenase properties and mechanisms of cytochrome P450, adv exp med biol. Edited by Hrycay EG, Bandiera SM, vol. 851. Cham: Springer; 2015:341–368.
- Hofrichter M, Kellner H, Herzog R, Karich A, Liers C, Scheibner K, Kimani VW, Ullrich R: Fungal peroxygenases: a phylogenetically old superfamily of heme enzymes with promiscuity for oxygen transfer reactions. In Grand challenges in fungal biotechnology, grand challenges in Biology and biotechnology. Edited by Nevalainen H, Cham: Springer; 2020:369–403.
- Molina-Espeja P, Gomez de Santos P, Alcalde M: Directed evolution of unspecific peroxygenase. In Directed enzyme evolution: advances and applications. Edited by Alcalde M, Cham: Springer; 2017:127–143.
- 9. Bormann S, Gomez Baraibar A, Ni Y, Holtmann D, Hollmann F: Specific oxyfunctionalisations catalysed by peroxygenases:

opportunities, challenges and solutions. *Catal Sci Technol* 2015, **5**:2038–2052.

- 10. Wang Y, Lan D, Durrani R, Hollmann F: Peroxygenases en route to becoming dream catalysts. What are the opportunities and challenges? *Curr Opin Chem Biol* 2017, 37:1–9.
- Urlacher VB, Girhard M: Cytochrome P450 monooxygenases in biotechnology and synthetic Biology. Trends Biotechnol 2019, 37:882–897.
- Hobisch M, Holtmann D, Gomez de Santos P, Alcalde M, Hollmann F, Kara S: Recent developments in the use of peroxygenases – exploring their high potential in selective oxyfunctionalisations. *Biotechnol Adv* 2021, 51:107615.
- Aranda C, Carro J, González-Benjumea A, Babot ED, Olmedo A, Linde D, Martínez AT, Gutiérrez A: Advances in enzymatic oxyfunctionalization of aliphatic compounds. *Biotechnol Adv* 2021, 51:107703.
- Sigmund MC, Poelarends GJ: Current state and future perspectives of engineered and artificial peroxygenases for the oxyfunctionalization of organic molecules. Nat Catal 2020, 3: 690–702.
- 15. Grogan G: Hemoprotein catalyzed oxygenations: P450s, UPOs, and progress toward scalable reactions. J Am Chem Soc 2021, 1:1312–1329.
- Münch J, Püllmann P, Zhang W, Weissenborn MJ: Enzymatic hydroxylations of sp3-carbons. ACS Catal 2021, 11: 9168–9203.
- 17. Alcalde M: Engineering the ligninolytic enzyme consortium. *Trends Biotechnol* 2015, **33**:155–162.
- Kinner A, Rosenthal K, Lütz S: Identification and expression of new unspecific peroxygenases – recent advances, challenges and opportunities. Front Bioeng Biotechnol 2021, 51: 107615.
- Molina-Espeja P, Garcia-Ruiz E, Gonzalez-Perez D, Ullrich R, Hofrichter M, Alcalde M: Directed evolution of unspecific peroxygenase from *Agrocybe aegerita*. *Appl Environ Microbiol* 2014, 80:3496–3507.
- Molina-Espeja P, Ma S, Mate DM, Ludwig R, Alcalde M: Tandemyeast expression system for engineering and producing unspecific peroxygenase. *Enzyme Microb Techol* 2015, 73–74. 29-23.
- Tonin F, Tieves F, Willot S, van Troost A, van Oosten R, Breestraat S, van Pelt S, Alcalde M, Hollmann F: Pilot-scale production of peroxygenase from Agrocybe aegerita. Org Process Res Dev 2021, 25:1414–1418.
- Molina-Espeja P, Cañellas M, Plou FJ, Hofrichter M, Lucas F, Guallar V, Alcalde M: Synthesis of 1-naphthol by a natural peroxygenase engineered by directed evolution. *Chem*biochem 2016, 17:341–349.
- Gomez De Santos P, Cañellas M, Tieves F, Younes SHH, Molina-Espeja P, Hofrichter M, Hollmann F, Guallar V, Alcalde M: Selective synthesis of the human drug metabolite 5'-hydroxypropranolol by an evolved self-sufficient peroxygenase. ACS Catal 2018, 8:4789–4799.
- 24. Gomez de Santos P, Cervantes FV, Tieves F, Plou FJ, Hollmann F, Alcalde M: Benchmarking of laboratory evolved unspecific peroxygenases for the synthesis of human drug metabolites. *Tetrahedron* 2019, **75**:1827–1831.
- Gomez De Santos P, Lazaro S, Vina-Gonzalez J, Hoang MD,
 Sánchez-Moreno I, Glieder A, Hollmann F, Alcalde M: Evolved peroxygenase-aryl alcohol oxidase fusions for self-sufficient oxyfunctionalization reactions. ACS Catal 2020, 10: 13524–13534.

A functional UPO fusion chimera was designed that could be employed in the synthesis of a range of pharmaceutical and chemical products. Libraries of fusion proteins were constructed with a range of linkers of different lengths and amino acid composition, along with several signal peptides. The final fusion chimera selected produced the best total turnover numbers for the synthesis of dextrorphan described to date.

 Ramirez-Escudero M, Molina-Espeja P, Gomez De Santos P, Hofrichter M, Sanz-Aparicio J, Alcalde M: Structural insights into the substrate promiscuity of a laboratory-evolved peroxygenase. *ACS Chem Biol* 2018, **13**:3259–3268.

- Knorrscheidt A, Püllmann P, Schell E, Homann D, Freier E, Weissenborn MJ: Identification of novel unspecific peroxygenase chimeras and unusual YfeX axial heme ligand by a versatile high-throughput GC-MS approach. ChemCatChem 2020, 12:4788–4795.
- Martin-Diaz J, Paret C, Garcia-Ruiz E, Molina-Espeja P, Alcalde M: Shuffling the neutral drift of unspecific peroxygenase in Saccharomyces cerevisiae. Appl Environ Microbiol 2018, 84:e00808–e00818.
- Martin-Diaz J, Molina-Espeja P, Hofrichter M, Hollmann F,
 Alcalde M: Directed evolution of unspecific peroxygenase in organic solvents. *Biotechnol Bioeng* 2021 118:3002–3014.

organic solvents. *Biotechnol Bioeng* 2021, **118**:3002–3014. UPO mutants were designed by conventional directed evolution (random mutation and DNA shuffling) to obtain those that perform well in the presence of organic co-solvents. The mutant selected was enriched by adding neutral mutations from a previous genetic drift campaign, which were filtered by site-directed recombination, revealing very active UPO variants in distinct organic milieus.

 Gomez de Santos P, Hoang MD, Kiebist J, Kellner H, Ullrich R, Scheibner K, Hofrichter M, Liers C, Alcalde M: Functional expression of two unusual acidic peroxygenases from *Candolleomyces aberdarensis* in yeasts by adopting evolved secretion mutations. *Appl Environ Microbiol* 2021, 87. e00878-21.

Using the PaDa-I mutational backbone, secretion mutations in both the signal peptide and the mature protein were transferred into two new, long, unusual acidic UPOs. After this engineering, secretion was fostered to the highest volumetric activity levels reported to date, highlighting the possibility of adopting evolved secretion mutations as a tool for the functional expression of other long UPO genes.

- Mate DM, Palomino MA, Molina-Espeja P, Martin-Diaz J, Alcalde M: Modification of the peroxygenative:peroxidative activity ratio in the unspecific peroxygenase from Agrocybe aegerita by structure-guided evolution. Protein Eng Des Sel 2017, 30:189–196.
- Ramirez-Ramirez J, Martin-Diaz J, Pastor N, Alcalde M, Ayala M: Exploring the role of phenylalanine residues in modulating the flexibility and topography of the active site in the peroxygenase variant PaDa-I. Int J Mol Sci 2020, 21:5734.
- **33.** Molina-Espeja P, Beltran-Nogal A, Alfuzzi MA, Guallar V, Alcalde M: **Mapping potential determinants of peroxidative activity in an evolved fungal peroxygenase from** *Agrocybe aegerita. Front Bioeng Biotechnol* 2021, **9**:741282.
- Rotilio L, Swoboda A, Ebner K, Rinnofner C, Glieder A, Kroutil W, Mattevi A: Structural and biochemical studies enlighten the unspecific peroxygenase from Hypoxylon sp. EC38 as an efficient oxidative biocatalyst. ACS Catal 2021, 11: 11511–11525.

This study provides a conscientious and thorough biochemical characterization of a novel recombinant UPO. Interesting features, such as relatively high stability to temperature, organic co-solvents and H_2O_2 are evident, while retaining proficient benzylic hydroxylation, alcohol oxidation and epoxidation of a panel of different substrates. The UPO's compact structure is analysed in conjunction with different ligands, representing the fourth UPO molecular structure made available to date.

- Piontek K, Strittmatter E, Ullrich R, Gröbe G, Pecyna MJ, Kluge M, Scheibner K, Hofrichter M, Plattner DA: Structural basis of substrate conversion in a new aromatic peroxygenase: cytochrome P450 functionality with benefits. J Biol Chem 2013, 288:34767–34776.
- Püllmann P, Knorrscheidt A, Münch J, Palme PR,
 Hoehenwarter W, Marillonnet S, Alcalde M, Westermann B, Weissenborn MJ: A modular two yeast species secretion system for the production and preparative application of fungal peroxygenases. Commun Biol 2021, 4:562.

The authors developed and applied a Golden Gate-based modular system to shuffle 17 signal peptides, 8 UPO genes and 7 proteinpurification tags in *S. cerevisiae* episomal plasmids. This system enabled recombinant *Mth*UPO and *Tte*UPO to be produced for the first time, displaying regio- and enantio selectivities that differed from other known UPOs. This system presents a rapid workflow to discover enzymatic activities with relevance in organic synthesis.

 Püllmann P, Weissenborn MJ: Improving the heterologous
 production of fungal peroxygenases through an episomal Pichia pastoris promoter and signal peptide shuffling system. ACS Synth Biol 2021, 10:1360–1372.

The authors developed a two-level platform for functional UPO expression in the methylotrophic yeast *P. pastoris*. Optimal promotersignal peptide combinations were identified through Golden Gate combinatorial assembly in episomal plasmids that allow mutant libraries for directed evolution to be constructed and screened. The best constructs could be transferred to integrative plasmids for high-yield, antibiotic-free protein production and characterization. The system was validated with 7 UPOs (two of them not previously expressed heterologously) and two non-UPO enzymes (CalB, Mrl2).

- Linde D, Olmedo A, González-Benjumea A, Estévez M, Renau-Mínguez C, Carro J, Fernández-Fueyo E, Gutiérrez A, Martínez AT: Two new unspecific peroxygenases from heterologous expression of fungal genes in *Escherichia coli*. *Appl Environ Microbiol* 2020, 86. e02899-19.
- Carro J, González-Benjumea A, Fernández-Fueyo E, Aranda C, Guallar V, Gutiérrez A, Martínez AT: Modulating fatty acid epoxidation vs hydroxylation in a fungal peroxygenase. ACS Catal 2019, 9:6234–6242.
- Menes-Rubio A: Exploring the functional heterologous expression of unspecific peroxygenase in Escherichia coli by designing SUMO-UPO fusions. Universidad Autonoma de Madrid. Master Thesis; Jul. 2021.
- Municoy M, González-Benjumea A, Carro J, Aranda C, Linde D, Renau-Mínguez C, Ullrich R, Hofrichter M, Guallar V, Gutiérrez A, Martínez AT: Fatty-Acid oxygenation by fungal perox- ygenases: from Computational simulations to preparative regio- and stereoselective Epoxidation. ACS Catal 2020, 10: 13584–13595.

This study illustrates how computational simulations help to comprehend the molecular determinants of UPO selectivity. Hypotheses built upon adaptive PELE simulations were experimentally validated with an array of wild-type and engineered UPOs carrying different hemechannel cavities. The results enabled peroxygenases with commercial potential to be selected for the preparative-scale production of α -linoleic epoxides.

- González-Benjumea A, Carro J, Renau-Mínguez C, Linde D, Fernández-Fueyo E, Gutiérrez A, Martínez AT: Fatty acid epoxidation by *Collariella virescens* peroxygenase and heme-channel variants. *Catal Sci Technol* 2020, 10:717–725.
- Knorrscheidt A, Soler J, Hünecke N, Püllmann P, Garcia-Borràs M, Weissenborn MJ: Accessing chemo- and regioselective benzylic and aromatic oxidations by protein engineering of an unspecific peroxygenase. ACS Catal 2021, 11: 7327–7338.
- 44. Knorrscheidt A, Soler J, Hünecke N, Püllmann P, Garcia-Borràs M, Weissenborn MJ: Simultaneous screening of multiple substrates with an unspecific peroxygenase enabled modified alkane and alkene oxyfunctionalisations. *Catal Sci Technol* 2021, **11**:6058–6064.
- 45. Shoji O, Fujishiro T, Nishio K, Kano Y, Kimoto H, Chien SC, Onoda H, Muramatsu A, Tanaka S, Hori A, et al.: A substratebinding-state mimic of H₂O₂-dependent cytochrome P450 produced by one-point mutagenesis and peroxygenation of non-native substrates. Catal Sci Technol 2016, 6:5806–5811.
- Cirino PC, Arnold FH: A self-sufficient peroxide-driven hydroxylation biocatalyst. Angew Chem Int Ed 2003, 42: 3299–3301.
- 47. Ma N, Chen Z, Chen J, Chen J, Wang C, Zhou H, Yao L, Shoji O, Watanabe Y, Cong Z: Dual-functional small molecules for generating an efficient cytochrome P450BM3 peroxygenase. *Angew Chem Int Ed* 2018, 57:7628–7633.
- **48.** Xu G, Crotti M, Saravanan T, Kataja KM, Poelarends GJ: **Enan-** tiocomplementary epoxidation reactions catalyzed by an**

engineered cofactor-independent non-natural peroxygenase. Angew Chem Int Ed 2020, **132**:10460-10464.

An interesting study illustrating how introducing mutations at functional hot-spots of a non-cofactor dependent 4-oxalocrotonate tautomerase can enhance promiscuous peroxygenase activity up to 60-fold in order to achieve enantio-complementary epoxidation of α , β -unsaturated aldehydes. The non-natural peroxygenase displayed outstanding enantioselectivity (near 98% *ee*) depending on the pH and oxygen donor (either t-BuOOH or H₂O₂).

- Leone L, D'Alonzo D, Balland V, Zambrano G, Chino M, Nastri F, Maglio O, Pavone V, Lombardi A: Mn-Mimochrome VI*a: an artificial metalloenzyme with peroxygenase activity. Front Chem 2018, 6:590.
- Leone L, D'Alonzo D, Maglio O, Pavone V, Nastri F, Lombardi A: Highly selective indole oxidation catalyzed by a Mn-containing artificial mini-enzyme. ACS Catal 2021, 11:9407–9417.
- Fujieda N, Nakano T, Taniguchi Y, Ichihashi H, Sugimoto H, Morimoto Y, Nishikawa Y, Kurisu G, Itoh S: A well-defined osmium-cupin complex: hyperstable Artificial osmium peroxygenase. J Am Chem Soc 2017, 139:5149–5155.
- 52. Shumayrikh NM, Warren JJ, Bennet AJ, Sen D:
 * A heme-DNAzyme activated by hydrogen peroxide catalytically oxidizes thioethers by direct oxygen atom transfer rather than by a Compound I-like intermediate. Nucleic Acids Res 2021, 49:1803–1815.

This study describes one of the few examples of a non-protein scaffold used to build a heme-containing DNA structure (G-quartet) that displays

peroxygenase-like activity. The resulting DNAzyme can catalyze the oxidation of thioether substrates (R_2S) to sulfoxide products (R_2SO).

- 53. Baek M, DiMaio F, Anishchenkol, Dauparas J, *et al.*: Accurate prediction of protein structures and interactions using a three-track neural network. *Science* 2021, 373:871–876.
- Jumper J, Evans R, Pritzel A, Green T, Figurnov M, Ronneberger O, Tunyasuvunakool K, Bates R, Žídek A, Potapenko A, *et al.*: Highly accurate protein structure prediction with AlphaFold. *Nature* 2021, 596:583–589.
- Weinstein J, Khersonsky O, Fleishman SJ: Practically useful protein-design methods combining phylogenetic and atomistic calculations. Curr Opin Struct Biol 2020, 63:58–64.
- Spence MA, Kaczmarski JA, Saunders JW, Jackson CJ: Ancestral sequence reconstruction for protein engineers. Curr Opin Struct Biol 2021, 69:131–141.
- Yang KK, Wu Z, Arnold FH: Machine-learning-guided directed evolution for protein engineering. Nat Methods 2019, 16:687–694.
- Wu Z, Johnston KE, Arnold FN: Protein sequence design with deep generative models. Curr Opin Chem Biol 2021, 65:18–27.
- Jacob S, Bormann S, Becker M, Antelo L, Holtmann D, Thines E: Magnaporthe oryzae as expression host for the production of the unspecific peroxygenase AaeUPO from the basidiomycete Agrocybe aegerita. Microbiology Open 2021, 10:e1229.