# **Biotechnology Advances**

# Overview of Flavin-containing Monooxygenase: History, Structures, Mechanism, Biosynthesis and Disease --Manuscript Draft--

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Abstract:	The Flavin-containing Monooxygenases (FMOs) are a significant protein family that is widely distributed in bacteria, yeasts, plants, and mammals. FMOs have been demonstrated to play a crucial functional role in drug metabolism and indigo biosynthesis. The research history of FMOs was reviewed. The structural analysis of FMOs was conducted to point out the catalytic mechanism, which can aid in comprehending their functions more profoundly. The catalytic example of indole was exhibited in the docking simulation. The differences across FMOs were comprehensible among sequence alignments. The potential improvements of FMOs were provided through de novo design, directed evolution, enzyme immobilization, metabolic engineering, and fermentation engineering, which provides additional insights into indigo and indirubin biosynthesis via FMOs.					
Suggested Reviewers:	Pablo Sobrado, PhD Professor, Virginia Polytechnic Institute and State University University Bookstore psobrado@vt.edu Their group studied the mechanism of mFMO and found that tryptophan-47 is important.					
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They achieved the highest yield of indigo biosynthesis so far.

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FMO was used to synthesize tyrian purple. A consecutive two-cell reaction system was used.

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They engineered bFMO for the efficient production of indirubin

Cover Letter

**COVER LETTER** 

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**Submission date:** 

September 20, 2023

Edward A. Bayer

Weizmann Institute of Science, Department of Biomolecular Sciences, Rehovot, Israel

Dear Prof. Edward A. Bayer,

We are pleased to submit our manuscript entitled "Overview of Flavin-containing

Monooxygenase: History, Structures, Mechanism, Biosynthesis and Disease" for full

consideration as an original article to the Journal "Biotechnology Advances". This review totally

investigated the research history, structures, mechanisms, and potential improvements of

flavin-containing monooxygenase (FMO), specially focusing on how to improve the

biosynthesis of indole and indirubin. We know the aims and scope of Biotechnology Advances

are on current developments and future trends in biotechnology. Our review exhibits the

potential application of FMOs in the industry and includes the research history and future

developing trends in improving the biosynthesis of indigo and indirubin via FMOs from various

aspects. We believe this article will be of special interest to the readers of Biotechnology

Advances.

This manuscript has not been previously published and is not under consideration in the

same or substantially similar form in any other peer-reviewed media.

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Yan: Project administration, Writing - Review & Editing, Funding acquisition.

**Conflict of interest** 

The authors declare no financial or commercial conflict of interest.

I appreciate your consideration of this manuscript.

Sincerely,

Yunjun Yan

Declaration of Interest Statement

#### **Declaration of interests**

⊠The authors declare that they have no known competing financial interests or personal relationships
that could have appeared to influence the work reported in this paper.
□The authors declare the following financial interests/personal relationships which may be considered
as potential competing interests:

# **Highlights**

- Flavin-containing monooxygenases (FMOs) have been involved in indigo biosynthesis for over 20 years.
- The relationship between structure and catalytic mechanism of flavin-containing monooxygenases is elucidated.
- Directed evolution, de novo design, and genome-scale metabolic network models (GEMs) are suggested to improve indigo and indirubin biosynthesis.
- Trimethylaminuria (TMAU) is a genetic disorder caused by a defect in hFMO3.

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#### Abstract

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14 The Flavin-containing Monooxygenases (FMOs) are a significant protein family that is 15 widely distributed in bacteria, yeasts, plants, and mammals. FMOs have been 16 demonstrated to play a crucial functional role in drug metabolism and indigo biosynthesis. The research history of FMOs was reviewed. The structural analysis of 17 FMOs was conducted to point out the catalytic mechanism, which can aid in 18 19 comprehending their functions more profoundly. The catalytic example of indole was 20 exhibited in the docking simulation. The differences across FMOs were comprehensible 21 among sequence alignments. The potential improvements of FMOs were provided through de novo design, directed evolution, enzyme immobilization, metabolic 22 23 engineering, and fermentation engineering, which provides additional insights into 24 indigo and indirubin biosynthesis via FMOs.

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- 26 **Keywords:** Flavin-containing Monooxygenase, Synthetic Biology, Catalytic
- 27 Mechanism, Indigo and indirubin biosynthesis, Bio-indigo

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#### Introduction

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In 2006, flavoprotein monooxygenases (FPMOs) were classified into six classes 62 according to sequence and structure date (van Berkel et al., 2006). Flavin-containing 63 Monooxygenase (FMO, EC 1.14.13.8) belongs to class B, which is encoded by a single 64 gene and contains a tightly bound FAD cofactor. FMO retains the coenzyme 65 NADPH/NADP+ bound during catalysis and is composed of two dinucleotide binding 66 domains (Rossmann fold) that bind FAD and NADPH, respectively. Recently, it was 67 68 discovered that FMO can be classified into two subtypes: type I and type II (Jensen et al., 2012; Riebel et al., 2013). Type I FMOs depend on NADPH as the coenzyme, which 69 70 are discussed mainly in this paper. While type II FMOs, such as Stenotrophomonas 71 maltophilia flavin-containing monooxygenase (SMFMO), which can perform Baeyer-72 Villiger oxidation and accept both NADPH and NADH as coenzymes, have not been 73 extensively studied (Ceccoli et al., 2014). 74 Eukaryotic FMOs are widely present in the livers of Oryctolagus cuniculus, Sus 75 scrofa, and Homo sapiens and are located at the endoplasmic reticulum (ER) of 76 hepatocytes towards the cytoplasm. Similar to cytochrome P450 (CYP450), FMOs are 77 involved in drug metabolism and mono-oxidation N and S of xenobiotic compounds. 78 Human FMO is classified into five categories: hFMO1, hFMO2, hFMO3, hFMO4, and 79 hFMO5. Studies on FMO1 in pig livers, the former hotspot in the related area, have 80 revealed the catalytic mechanism and the universality of substrates of FMOs (Table 2) (Poulsen and Ziegler, 1979; Ball and Bruice, 1980; Beaty and Ballou, 1981a, b; Ziegler, 1993). The expression levels of FMOs vary significantly across different species (Table 1). The species specificity of FMO is likely relevant to the susceptibility and secretion efficiency of toxins and xenobiotics. Furthermore, even within humans, the expression levels of hFMOs can vary depending on factors such as tissue, age, and sex (Zane et al., 2018). hFMO1 exists mainly in fetal livers, adult kidneys, and intestines, while hFMO3 is mainly expressed in adult kidneys. hFMO3, owing to its significance in disease, is currently the most extensively studied (Phillips and Shephard, 2020a). It was found that a close link between hFMO3 mutation and trimethylaminuria (TMAU) (Treacy et al., 1998). Unlike mammals, yeast only has one FMO isoform, yFMO, which exerts its effect on protein folding (Suh et al., 1996; Suh et al., 1999). In plants, FMO is the rate-limiting enzyme in auxin biosynthesis, catalyzing oxidative decarboxylation of indole-3-pyruvate acid (IPyA) to form indole-3-acetic acid (IAA) (Cao et al., 2019). Bacterial FMO, also known as trimethylamine monooxygenase (TMM), besides oxidizing many compounds containing nitrogen and sulfur, is also able to oxidize indole, trimethylamine (TMA), dimethylsulfate (DMS), and dimethylsulfoxide (DMSO) (Chen et al., 2011; Choi et al., 2003). Through metagenomes, TMM was found to play a pivotal but often neglected role in the global carbon and nitrogen cycles (Chen et al., 2011). The first bacterial FMO, Methylophaga sp. strain SK1 (mFMO) (Choi et al.,

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2003), was used in engineered Escherichia coli to produce indigo. Further research suggested that it also catalyzes indole derivatives into indigoid dyes (Rioz-Martinez et al., 2011). It is important to note the mechanism of FMOs in the synthesis of indigo. In bacteria, tryptophan is converted to indole by tryptophanase (TRP), and FMOs subsequently oxidize indole to 2-hydroxyindole or 3-hydroxyindole, which are oxidized to isatin by oxygen. Isatins then dimerize into indigo or indirubin (Fig. 5C). 107 Indigo, a natural dye commonly extracted from plants, has a history of over 6,000 108 years of traditional extraction techniques. Indigo is widely used in the textile industry 109 for dyeing jeans and other fabrics. However, the production of around 80,000 tonnes of 110 indigo each year involves the use of non-renewable petrochemicals and results in the generation of toxic compounds (Linke, J.A. et al., 2023). To address these issues, 111 112 bio-indigo, which involves the use of synthetic biology to synthesize indigo from 113 tryptophan or indole, has been proposed as a sustainable and eco-friendly alternative. 114 Although several countries, such as China, America, and France, have companies that 115 are making efforts to commercialize bio-indigo, the process has been hindered by low 116 yields. FMOs, which have been shown to possess the ability to synthesize bio-indigo, 117 are regarded as promising enzymes to overcome this limitation. Indirubin, an indole 118 alkaloid used as a drug in chronic myeloid leukemia, has shown anticancer effects 119 (Yang et al., 2022), and traditional production methods rely on plant cell culture extraction (Han et al., 2012). Biosynthetic processes are needed to improve production 120

#### efficiency and conditions (Berry et al., 2002; Choi et al., 2003; Cho et al., 2011).

Except biosynthesis, FMOs also play crucial roles in other aspects. The superoxide anion radical generated by FMOs is considered to regulate the overall redox state of cells (Krueger and Williams, 2005). In *Caenorhabditis elegans*, *fmo-2/FMO5* is regulated by NHR-49/PPAR-a during infection of *Staphylococcus aureus*, revealing that FMOs are critical innate immunity effectors in animals (Wani et al., 2021). In mice, the biological clock genes regulate FMO5 expression by transcription of cis-acting elements E-box and D-box (Chen et al., 2019), suggesting that hFMOs may play a more extensive role in the human body.

This paper provides a comprehensive review of the research progress on FMOs, particularly on mFMO. The structure and catalytic mechanism of mFMO are highlighted, and the advances in indigo and indirubin biosynthesis are discussed, providing a prospect for scientists to improve the yields through new strategies and potentially expand the application of mFMO.

#### 1. The research history of FMOs

## 1.1 The evolution and diversity of the FMO gene family

In 1972, Dr. Ziegler isolated a mixed-function enzyme from the pig liver that catalyzes N-oxidation of amine (Fig. 1) (Ziegler and Mitchell, 1972). The enzyme can oxidize a wide variety of nitrogen-, sulfur-, and phosphorus-containing xenobiotics. It was named

Flavin-containing Monooxygenases, rather than being named restrictively mixed-function, amine oxidase, or simply N-oxidase (Ziegler, 2002).

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144 -----**Fig 1**-----

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In the 1980s, Tynes et al. identified differences between hepatic and pulmonary forms of microsomal FMO in mice and rabbits (Tynes et al., 1985). Since then, over 150 types of FMOs have been successfully isolated from various species (van Berkel et al., 2006). Currently, there are 11 genes encoding hFMOs in H. sapiens (FMO1-FMO5, FMO6P-FMO11P), of which only FMO1-FMO5 encode catalytic proteins. FMO 1-5 share approximately 50%-58% amino acid identity across different species (Lawton et al., 1994; Yang, 2017). The FMO gene family is conserved across all phyla that have been examined so far. Hence, some forms of the FMO gene family can be found in all studied eukaryotes. FMO genes are defined by specific structural and functional restrictions, which have prompted the evolution of different types of FMOs to fulfill various tasks. The functional subtypes of FMOs (FMO 1-5) began to diverge before the evolution of mammals and amphibians into distinct classes. FMO5, which was identified in vertebrates, is the first functionally unique member of the FMO family and appears to have evolved earlier than other forms of FMOs. According to phylogenetic studies, the most recent FMOs to develop into enzymes with distinct functions are FMO1 and FMO3. FMOs in invertebrates have developed polyphyletically, which means that an invertebrate evolved a phenotypically similar gene that was not passed down from a shared ancestor (Hao et al., 2009).

FMO proteins share several conserved domains are shown in Figure 2, including the FAD binding domain (GxGxxG/A) (Burnett et al., 1994), the FMO protein recognition motif (FxGxxxHxxxY/F) (Alfieri et al., 2008), and the NADP<sup>+</sup> binding domain (GxSxxG/A) (Lawton et al., 1994). Leu375 is conserved in both hFMO and AncFMO (ancient mammalian FMO), and acts as a tunnel gatekeeper (Levin, 1992). Asn78 in mFMO is conserved in all FMOs (marked green in Fig. 5), and two additional oxygen molecules are located in its side chain group, contributing to the stability of oxygen molecules through polarity and affecting enzyme activity in various FMO proteins (Alfieri et al., 2008).

It is worth noting that while hFMO is an insoluble protein, mFMO is water-soluble and its FAD is exposed to the solvent, making it easier to bind to the matrix (Phillips and Shephard, 2020b). The homology between the two proteins is only 20.7% (Fig. 2B). Furthermore, as shown in Fig. 2B, cFMO, cloned from *Corynebacterium glutamicum*, has little homology with various FMO proteins found in bacteria and mammals.

180 -----Fig 2------

 Table 1. The expression difference of mammalian FMOs

Species	FMO subtypes	Tissue	Developmental stage	Sex difference	References
Homo sapiens	FMO1	-The primary subtype in adult kidney	-High expression in fetal, silent post parturition	-No significant gender difference	Dolphin et al., 1996; Hernandez et
	FMO2	-The primary subtype in <i>adult</i> lung	parturition		al., 2004; Zhang and Cashman, 2006
	FMO3	-The primary subtype in adult liver	-Low expression in fetal, gradually increases post parturition		
	FMO4	-Liver, kidney, lung, small intestine et al.			
	FMO5	-Liver, small intestine, kidney, lung et al.			
Mus musculus	FMO1	-Lung, kidney, brain	-Expression in fetal liver gradually increased to reach that of female mice levels post parturition; Expression in the brain is the most in neonatal	-Gender difference is noticeable 28 days after birth. The expression in female mice remains unchanged, while that of male mice is inhibited	Cherrington et al., 1998; Janmohamed et al., 2004
	FMO2	- Low expression		-No significant gender difference	
	FMO3	-The primary subtype in adult female mouse liver	-Fetal liver expression is low and reaches adult expression level 14 days post parturition	-Gender differences demonstrated after sexual maturity	
	FMO4	-Low expression		-No obvious	

	FMO5	-Liver, kidney, small intestine	-Expression is detectable 17 days after gestation and reaches the expression of adult	gender difference -Expression level in female mice was higher than that of male mice	
Rattus norvegicus	FMO1	-Liver	level 2 days post parturition	in liver and kidney -Higher expression level in males than female	Cherrington et al., 1998; Lattard et al., 2003
	FMO2	-Kidney		-No obvious gender difference	
	FMO3	-Liver (lower expression level than that of FMO1)			
	FMO4	-Low expression in kidney and brain			
	FMO5	-Liver			
Cynomolgus	FMO1	-Kidney			Uno et al.,
тасаqие	FMO2	-Lung, kidney, heart, jejunum			2013
	FMO3	-Liver, kidney, lung, jejunum			
	FMO4	-Kidney, liver, lung, jejunum			
	FMO5	-Liver, lung, jejunum			
	FMO6	-Low expression in all tissue			
Oryctolagus cuniculus	FMO1	-Liver, intestinal mucosa			Larsen-Su et al., 1999;
	FMO2	-Lung	-FMO2 levels in the fetal lung are high at late gestation (except for day 28). After parturition, FMO2 levels fall dramatically,		Shehin-Johnson et al., 1995

<u> </u>		J.	followed by	
			significant recovery by	
			21 days after birth	
FMO	3 -I	Liver (lower		
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#### 1.2 From early reports to recent advances in FMO-mediated synthesis

In 1979, the catalytic model of mammalian FMOs was proposed based on spectrum and kinetic studies of pig FMO (pFMO) (Poulsen and Ziegler, 1979). In 1980, the catalytic C4a-(hydro)peroxide intermediate was discovered (Ball and Bruice, 1980), which was further demonstrated in 1981 (Beaty and Ballou, 1981a, 1981b). In 2008, the structure of mFMO was resolved at a 2.6 Å resolution (Fig. 4A) (Alfieri et al., 2008). In 2019, the structural movements of FMOs responding to different classes of substrates were unraveled (Fürst et al., 2019b).

The earliest record of indigo biosynthesis arises from the study of naphthalene dioxygenases (Ensley et al., 1983). In 1989, the pBS959 plasmid was constructed based

dioxygenases (Ensley et al., 1983). In 1989, the pBS959 plasmid was constructed based on the naphthalene dioxygenase gene and pUC19 plasmid, which realized the synthesis of indigo in recombinant *E. coli* (Boronin et al., 1989). In 1993, a recombinant *E. coli* capable of producing indigo from glucose was also developed (Murdock et al., 1993). However, the yield was only 135 mg/L. The indigo synthesis pathways of other aromatic hydrocarbon-degrading bacteria were also identified. In 1997, two

indigo-synthesizing strains, Pseudomonas putida S12 and CA-3, were identified (O'Connor et al., 1997). The toluene dioxygenases from *P. putida* NCIB11767 (Stephens et al., 1989) and P. putida F1 (Woo et al., 2000) both demonstrated the ability to synthesize indigo. However, the ability to synthesize indigo of naphthalene dioxygenases and toluene dioxygenase is limited, and their production capacity fails to exceed 300 mg/L. Other classes of oxidases, such as toluene-4-monooxygenase from P. 205 mendocina and functional enzymes similar to Multicomponent phenol hydroxylases in Acinetobacter sp. ST-550 (Doukyu et al., 2002; Doukyu et al., 2003) can also synthesize indigo, but their yield are inferior to mFMO, which has been widely studied for indigo 208 biosynthesis. Choi et al. were the first to report synthesizing indigo by mFMO effectively in 2003 (Choi et al., 2003). Subsequent research on mFMO-catalyzed indigo biosynthesis was based on this study. With further optimization of the sequence and fermentation process (Han et al., 2008), Han et al. reported an indigo yield of 911 mg/L in recombinant E. coli (Han et al., 2011). By adjusting cysteine concentration in the 213 tryptophan medium, the production of indigo was increased. In later studies, it was found that cysteine also had a significant impact on the catalytic selectivity of mFMO. During the oxidation catalytic process, the concentration of cysteine increased, and the 216 reaction tended towards the indirubin synthesis (Kim et al., 2019), which is of great significance to the synthesis of indirubin by mFMO. Numerous indigo-producing bacterial FMOs were also reported (Ameria et al., 2015; Lončar et al., 2019a). However,

their yields were not comparable to mFMO. To overcome the limitations of indigo and indirubin biosynthesis by FMOs, various methods were employed, including enzyme engineering and fermentation engineering (Chen et al., 2021; Hsu et al., 2018; Lončar et al., 2019b; Sun et al., 2022).

- 2. Structures and catalytic mechanisms
- 225 2.1 The structure and catalytic mechanism of mammalian FMOs, for instance,
- **AncFMO3-6**
- The catalytic mechanism of AncFMOs is similar to that of human FMOs, with sequence identities ranging from 82% to 92%. The resolved structures of AncFMOs provide valuable insights into the catalytic mechanism and functions of mammalian FMOs (Nicoll et al., 2020).
  - Residues 510-532 of AncFMO3 form two α-helices that anchor AncFMO3 tightly to the membrane in a highly hydrophobic transmembrane area (pale green in Fig. 3). AncFMO3-6 also contains two strictly conserved Rossmann fold binding areas for FAD (residues 2–154 and 331–442, pale cyan in Fig. 3) and NADP(H) (residues 155–213 and 296–330, light blue in Fig. 3). An insertion constructed by three α-helices (orange in Fig. 3), creates a ridged triangular fold that masks the FAD and the catalytic site (Fig. 3B), providing a tunnel from the membrane to the catalytic cavity (Fig. 3C). This structure suggests that substrates enter the blocked catalytic cavity from the tunnel.

Ser62 of AncFMO3-6 can form hydrogen bonds with the N3 atom of the isoalloxazine ring and orientate the FAD towards the catalytic cavity (Fig. 3E). Additionally, Asn61, which is well-conserved in human FMOs near the C4a of the isoalloxazine ring, stabilizes the C4a-(hydro)peroxide intermediate. Mutations of Asn61 cause trimethylaminuria. The residue Leu375 protects the catalytic cavity from solvents.

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## 245 -----**Fig 3**-----

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#### 2.2 The structure and catalytic mechanism of mFMO

Ongoing studies have described the complete catalytic model of FMOs (Ziegler, 1993) 248 249 (Fig. 4E). The procedure involves five steps, including (1) FAD reduction to FADH<sub>2</sub> by 250 NADPH and an additional H<sup>+</sup>, (2) interaction of FADH<sub>2</sub> with O<sub>2</sub> to form a stable 251 C4a-(hydro)peroxide intermediate, (3) single oxidation of the closing substrates without 252 particular binding, (4) discharge of the residuary oxygen atom as H<sub>2</sub>O, and (5) the 253 whole cycle returns to the initial state when NADP+ is separated from FMO. Since 254 substrates do not need to provide reducing potential and specifically bind to FMO, they 255 are extensive. Theoretically, any nucleophilic compound that could get close to 256 FAD-OOH can become a substrate of FMO. However, molecular size and charges affect the selectivity of FMO. Substrates with one positive charge have the highest affinity to 257 258 FMO (Ziegler, 2002).

mFMO has 456 amino acids and automatically forms homodimers in vivo (Alfieri et al., 2008) (Fig. 4A) and is not a membrane-associated protein like hFMO. There is one Rossmann fold binding area for FAD (1-169 and 281-461, pale cyan in Fig. 4), one Rossmann fold binding area for NADP<sup>+</sup> (170–280, light blue in Fig. 4), and three loops (44-80, 166-186, and 276-306, pale green in Fig. 4) linking the above two domains, lacking secondary structural elements. Both FAD and NADPH are the necessary cofactors of FMO. FMO oxidizes substrates by transferring the oxygen atom from C4a. At the same time, NADPH facilitates the reduction of FAD by transferring the hydrogen atom from C4 to N5. Additionally, NADPH's existence is essential for the stability of the C4a-(hydro)peroxide intermediate (Catucci et al., 2020). NADP<sup>+</sup> masks the catalytic cavity, providing a proper H-bonding environment that probably protects N5 of the flavine from solvents, maintains the catalytic intermediate, prolongs the intermediate half-life, and offers more chances to react. Tyr212 is a critical amino acid that assists the ribose of NADP+ to protect NADPH from solvent interference (Fig. 4D). Tyr212 and residues 407-415 could facilitate the approach of substrates and catalytic intermediates. Consistent with the findings, our AutoDock (Morris et al., 2009) data indicate that Tyr212 also affects the catalytic process (Fan and Xie, 2023). Specifically, we found that Tyr212 can restrict the size of the catalytic cavity, limit the dimensions of substrates, and protect substrates from solvents, functioning as a "doorkeeper" (Fig. 5B). Moreover, Trp47 is an important residue for the rate of hydride transfer from NADPH to the flavin

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The AutoDock simulation revealed that Asn78 is in the catalytic cavity and proximity to indole, FAD, and NADP(H). We believe that Asn78 plays an important role in the catalytic process. Indole was found to be contained in the catalytic cavity, forming hydrogen bonds with NADP(H), and closing the isoalloxazine ring of FAD (Fig. 5A).

285 -----Figs 4, 5-----

**Table 2**. The K<sub>cat</sub> and K<sub>m</sub> of different FMO subtypes on various substrates

FMO subtypes	Substrates	$K_{cat}(S^{-1})$	$K_{\text{m}}(\mu M)$	$K_{cat}/K_m(S^{\text{-}1}M^{\text{-}1})$	References
AsFMO <sup>a</sup>	Allyl mercaptan	$0.75 \pm 0.01$	$(1\pm0.1)\times10^3$	$(0.75 \pm 0.08) \times 10^3$	
	L-cysteine	$1.7 \pm 0.03$	$(5\pm0.4)\times10^3$	$(0.34 \pm 0.03) \times 10^3$	Valentino
	N-acetyl L-cysteine	$0.57 \pm 0.004$	$(7\pm0.4)\times10^3$	$(0.08 \pm 0.005) \times 10^3$	et al., 2020
AncFMO2	Methimazole	$0.19 \pm 0.01$	$106 \pm 22$		
	Thioanisole	$0.3\pm0.02$	$6.9 \pm 1.6$		
	Trimethylamine	$0.16\pm0.008$	$445\pm74$		
	NADPH	$0.32 \pm 0.05$	$7.8 \pm 1.4$		
	$NADPH_{uncoupling} \\$	$0.02\pm0.001$	$20 \pm 5.4$		
AncFMO3-6	Methimazole	$0.19\pm0.005$	$21\pm2.3$		
	Thioanisole	$0.1 \pm 0.008$	$128\pm38$		Nicoll et al., 2020
	Trimethylamine	$0.24 \pm 0.01$	$41 \pm 6.3$		ai., 2020
	NADPH	$0.13 \pm 0.008$	$3.5\pm0.86$		
AncFMO5	$NADPH_{uncoupling} \\$	$0.022 \pm 0.002$	$16 \pm 5.4$		
	Heptan-2-one	$0.07\pm0.003$	$6.36 \pm 1.2$		
	NADPH	$0.06\pm0.001$	$6.48 \pm 0.38$		
	$NADPH_{uncoupling} \\$	$0.03 \pm 0.001$	$2.1\pm0.5$		
bFMO a	Indole	$0.22 \pm 0.01$	$(0.98\pm0.12)\times$	$(0.22 \pm 0.02) \times 10^3$	Sun et al.,

			$10^{3}$		2022
	Indole (K223R/D317S)	$0.79 \pm 0.03$	$(0.55 \pm 0.14) \times 10^3$	$(1.45 \pm 0.30) \times 10^3$	2022
MBP-cFMO	Trimethylamine	2.6	575	4521.7	Jung et al., 2018
	Thiourea	0.67	380	1750	Ameria et
	Cysteamine	1.83	6000	300	al., 2015
hFMO1 a	Methimazole	1.07	7		
	Imipramine	0.85	14		Furnes and
	Fenthion	1.55	340		Schlenk, 2004
	Methyl p-tolyl sulfide	0.767	284		2004
hFMO2	Thiourea	0.85	27		Henderson
	Phorate	0.683	57		et al., 2004
	Ethylene thiourea	0.833	14		
	a-Naphthylthiourea	0.55	42		Krueger et al., 2002b
	1-Phenylthiourea	0.4	29		ai., 20020
	Disulfoton	0.333	32		Krueger et al., 2002a
hFMO3	Benzydamine	$3.12 \pm 0.20 \; (min^{-1})$	$52.0 \pm 9.0$		Bortolussi
	Tamoxifen	$1.13 \pm 0.70 \; (min^{-1})$	$6.40 \pm 0.70$		et al., 2021
	Fenthion	0.183	145		Furnes and Schlenk, 2004
	5-DPT	0.85	155		Cashman
	Trimethylamine	3.15	32		et al., 2000
	Tyramine	1.833	231		2000
Truncated hFMO3	Benzydamine	$4.51 \pm 0.18 \text{ (min}^{-1}\text{)}$	$53.0 \pm 6.1$		Bortolussi
	Tamoxifen	$1.63 \pm 0.01 \; (min^{-1})$	$5.60 \pm 0.30$		et al., 2021
mFMO a	Trimethylamine	$7.3 \pm 0.6$	$6.1 \pm 0.1$	$(8.4\pm0.7)\times10^5$	
	Trimethylamine (E158A/E159A)	$7.1 \pm 1$	$6.4 \pm 0.3$	$(9.0\pm1)\times10^5$	
	Nicotine	$130 \pm 30$	$3.0\pm0.2$	$(2.3 \pm 0.6) \times 10^4$	Alfieri et
	Methimazole	$66 \pm 7$	$1.0\pm0.02$	$(1.5 \pm 0.2) \times 10^4$	al., 2008
	N, N dimethylaniline	$232 \pm 28$	$1.8 \pm 0.4$	$(7.8\pm2)\times10^3$	
	Indole	90 ± 14	$0.7 \pm 0.03$	$(7.8\pm1)\times10^3$	

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	Trimethylamine	23 (nmol/min/mg protein)	19		<del>   </del>
NUT 10 a	Cysteamine	29 (nmol/min/mg protein)	180		Choi et al., 2003
	Thiourea	17 (nmol/min/mg protein)	390		
NiFMO <sup>a</sup>	Trimethylamine	$2.01 \pm 0.08$	$45.6 \pm 9.6$	44,000	
	Methimazole	$1.10 \pm 0.08$	$77 \pm 10$	14,000	
	Pyrrole	$0.69 \pm 0.03$	$46 \pm 17$	4,800	
	Indoline	$0.70 \pm 0.03$	$98 \pm 14$	7,100	Lončar et
	Indole	$0.11 \pm 0.01$	$137 \pm 23$	730	al., 2019a
	6-Bromoindole	$0.09 \pm 0.03$	$640 \pm 340$	140	
	Tris(hydroxymethyl) aminomethane (TRIS)	$0.18 \pm 0.02$	$21500 \pm 5600$	9	
pFMO1 <sup>a</sup>	Dihydrolipoic acid		1700		Taylor and
	Lipoic acid		120		Ziegler, 1987
	Trimethylamine		617		Sabourin and Hodgson, 1984
rFMO2 a	n-Heptylamine	27,000			
	N-octylamine	6700			
	N-nonylamine		1800		
	N-decylamine		400		Tynes et al., 1986
	N-undecylamine		90		a1., 1900
	N-dodecylamine		33		
	N-tridecylamine		13		
	JL				

 $<sup>288 \</sup>qquad {}^a \ As = \textit{A. sativum}; \ b = \textit{Methylophaga aminisulfidivorans}; \ c = \textit{Corynebacterium glutamicum}; \ h = \textit{Methylophaga aminisulfidivorans}; \ c = \textit{Corynebacterium glutamicum}; \ h = \textit{Methylophaga aminisulfidivorans}; \ c = \textit{Corynebacterium glutamicum}; \ h = \textit{Methylophaga aminisulfidivorans}; \ c = \textit{Corynebacterium glutamicum}; \ h = \textit{Methylophaga aminisulfidivorans}; \ c = \textit{Corynebacterium glutamicum}; \ h = \textit{Methylophaga aminisulfidivorans}; \ c = \textit{Corynebacterium glutamicum}; \ h = \textit{Methylophaga aminisulfidivorans}; \ c = \textit{Corynebacterium glutamicum}; \ h = \textit{Methylophaga aminisulfidivorans}; \ c = \textit{Corynebacterium glutamicum}; \ h = \textit{Methylophaga aminisulfidivorans}; \ c = \textit{Corynebacterium glutamicum}; \ h = \textit{Methylophaga aminisulfidivorans}; \ c = \textit{Corynebacterium glutamicum}; \ h = \textit{Methylophaga aminisulfidivorans}; \ c = \textit{Corynebacterium glutamicum}; \ h = \textit{Methylophaga aminisulfidivorans}; \ c = \textit{Corynebacterium glutamicum}; \ h = \textit{Methylophaga aminisulfidivorans}; \ c = \textit{Corynebacterium glutamicum}; \ h = \textit{Methylophaga aminisulfidivorans}; \ c = \textit{Corynebacterium glutamicum}; \ h = \textit{Methylophaga aminisulfidivorans}; \ c = \textit{Corynebacterium glutamicum}; \ h = \textit{Methylophaga aminisulfidivorans}; \ c = \textit{Corynebacterium glutamicum}; \ h = \textit{Methylophaga aminisulfidivorans}; \ c = \textit{Corynebacterium glutamicum}; \ h = \textit{Methylophaga aminisulfidivorans}; \ c = \textit{Corynebacterium glutamicum}; \ h = \textit{Methylophaga aminisulfidivorans}; \ c = \textit{Corynebacterium glutamicum}; \ h = \textit{Methylophaga aminisulfidivorans}; \ c = \textit{Corynebacterium glutamicum}; \ h = \textit{Methylophaga aminisulfidivorans}; \ c = \textit{Corynebacterium glutamicum}; \ h = \textit{Methylophaga aminisulfidivorans}; \ c = \textit{Corynebacterium glutamicum}; \ h = \textit{Methylophaga aminisulfidivorans}; \ c = \textit{Corynebacterium glutamicum}; \ h = \textit{Methylophaga aminisulfidivorans}; \ c = \textit{Corynebacterium glutamicum}; \ c$ 

290 Oryctolagus cuniculus.

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## 3. The application of FMO in biosynthesis

 $<sup>289 \</sup>qquad \textit{Homo sapiens}; \ m = \textit{Methylophaga sp. strain SK1}; \ Ni = \textit{Nitrincola lacisaponensis}; \ p = \textit{Sus scrofa}; \ r = \textit{Nitrincola lacisaponensis}; \ p = \textit{Sus scrofa}; \ r = \textit{Nitrincola lacisaponensis}; \ p = \textit{Sus scrofa}; \ r = \textit{Nitrincola lacisaponensis}; \ p = \textit{Sus scrofa}; \ r = \textit{Nitrincola lacisaponensis}; \ p = \textit{Sus scrofa}; \ p = \textit{Sus scrof$ 

#### 3.1 The advantages of FMO among enzymes in indigo biosynthesis

In the field of indigo biosynthesis, researchers aim to achieve higher bio-yield and simpler production conditions. FMO is currently the most studied enzyme in this regard and is particularly prominent in these two aspects. While there are reports on the biosynthesis of indigo using other enzymes, most of them remain at the primary level of "observed phenomena".

For instance, Cytochrome P450 monooxygenases have been observed to synthesize indigo under specific conditions (Fiorentini et al., 2018; Kim et al., 2018), but their biosynthetic ability has not been thoroughly explored, perhaps due to the characteristics and productive ability of the enzyme. Similarly, multicomponent enzymes without heme, such as Naphthalene dioxygenases (Doukyu et al., 2002; Pathak and Madamwar, 2010; Groeneveld et al., 2016) and multicomponent phenol hydroxylases (Doukyu et al., 2003; Qu et al., 2012a), have been used as biocatalysts, but their application is limited by the fermentation conditions. The yield of indigo synthesized by these enzymes has not exceeded 300mg/L due to the need for stable conditions for each component, which makes FMOs with simple components more practical for utilization.

Furthermore, it has been shown that D flavoprotein monooxygenases, a close relative of FMO, can synthesize indigo (Dai et al., 2019), but further research is needed to understand the underlying mechanism on the biosynthetic level.

#### 3.2 FMO-Catalyzed Biosynthesis of Indigo

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314 FMOs possess a unique oxidative catalytic mechanism, and their application in 315 biosynthesis, particularly in the synthesis of indigoid compounds, has been extensively 316 studied (Table 3). Indigo, one of the oldest textile dyes, has traditionally been produced 317 through plant extraction or chemical synthesis (Stasiak et al., 2014). However, to develop an environmentally friendly strategy, biosynthesis of indigo using 318 319 microorganisms has been proposed (Qu et al., 2010; Honda et al., 2008; Qu et al., 320 2012b), and engineered E. coli has been validated for indigo biosynthesis (Ensley et al., 321 1983; Murdock et al., 1993; Berry et al., 2002; Doukyu et al., 2003). The discovery of 322 mFMO from Methylophaga sp. strain SK1 has significantly improved the efficiency of 323 heterologous biosynthesis of indigo (Choi et al., 2003). 324 In the biosynthetic strategy, indole is used as a substrate or intermediate in the 325 pathway. With the help of heterologous FMO, indole is oxidized to 3-hydroxyindole (indophenol/hydroxyindole), which further forms indigo by spontaneous dimerization 326 327 under aerobic conditions (Choi, 2020; Han et al., 2008). However, the productivity of 328 the original plasmid carrying mFMO was limited, and optimization of the engineered 329 plasmid was implemented. After removing the redundant sequences, the indigo yield of 330 the improved plasmid reached 662 mg/L, an increase of 413% compared to the initial 331 production of 160 mg/L (Han et al., 2008). Moreover, a yield of 920 mg/L in a 5L 332 fermenter was achieved, and a larger scale fermentation system was developed, which achieved a yield of 911  $\pm$  22 mg/L of indigo in a 3,000 L fermenter with an input of 2 g/L of tryptophan (Han et al., 2011).

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Numerous studies have been conducted to improve the properties of the enzyme and optimize biosynthetic conditions (Table 3). For instance, a consecutive two-cell reaction system was constructed using mFMO, 6-halogenase SttH, and tryptophanase TnaA to synthesize 6,6'-dibromoindigo (6BrIG) with a yield of 315.0 mg/L from tryptophan (Lee et al., 2021). The redox reaction of FAD cofactor, which tightly links with FMO, depends on the assistance of NADPH (Alfieri et al., 2008; Krueger and Williams, 2005). To recycle NADPH, an optimized strategy of fusing mFMO and phosphate dehydrogenase (PTDH) was proposed to utilize phosphate as a cheap and sacrificial substrate (Rioz-Martinez et al., 2011). This bifunctional enzyme, mFMO-PTDH, not only exhibits the ability to oxidize indole and its analogs but also shows potential for chirality selection in the biocatalytic sulfoxide oxidation of prochiral sulfides (Pereira et al., 2022; Schnepel et al., 2021; Wojaczyńska and Wojaczyński, 2020). Moreover, directed evolution was applied for mFMO modification, and some mutants exhibited higher K<sub>cat</sub> and lower K<sub>m</sub>, showing higher indole affinity and superior catalytic efficiency at low substrate concentrations (Lončar et al., 2019b).

Since indigo itself is insoluble in water, it requires the addition of reductants such as sodium sulfate to modify it into a water-soluble dye in practical production, which increases economic and environmental burdens. A novel strategy of chemical group

protection was proposed to effectively solve the insolubility problem of indigo in water. A glycosyltransferase from *Polygonum tinctorium* was co-expressed with mFMO in E. coli to introduce a glucose group to protect the active hydroxyl group of hydroxyindole and form a water-soluble and stable indican to prevent indigo from further oxidation (Hsu et al., 2018). Subsequently, by adding glucosylase to remove the protective groups, the production of indigo was restored, showing excellent practical properties. To reduce the substrate cost of indigo fermentation, a system based on the co-cultivation of microorganisms was developed to convert renewable carbon substrates to indigo (Chen et al., 2021). The system can be divided into upstream and downstream parts: the upstream engineered E. coli is responsible for the synthesis of tryptophan from glucose or glycerol; the downstream system is responsible for the conversion of tryptophan to indole and then to indigo. Besides, the metabolism of the two strains was specially optimized, and the final indigo yield reached 104.3 mg/L, which was more than eleven folds higher than the original strain.

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Recently, a strategy was implemented to increase the cyclopropane fatty acid (CFA) composition of phospholipid fatty acids in the cell membrane to counteract the cytotoxic effects of indole. This approach resulted in a 1.5-fold increase in indigo production compared to the control strain (Ham et al., 2023). Additionally, the enzyme TRP can convert tryptophan into indole and pyruvate (Shimada et al., 2004). As pyruvate can be used by the cell to regenerate NADPH, a bifunctional fusion enzyme of

mFMO-TRP was developed to produce indigo from L-tryptophan. This approach resulted in the complete conversion of 2.0 g tryptophan into 1.7 g indigo per liter of culture (Fabara and Fraaije, 2020).

In addition to mFMO, other FMOs isolated from various organisms have shown potential for synthesizing indigo compounds. For instance, FMO motifs encoded by *Mesorhizobia* and *Sphingomonas* isolated from wastewater sludge by metagenomic methods exhibit biocatalytic activity for indigo synthesis (Singh et al., 2010). PtFMO was cloned from *P. tinctorium* and heterologously expressed in *E. coli* BL21 (DE3), achieving a 30 mg/L indigo yield (Inoue et al., 2021). The cFMO, cloned from *Corynebacterium glutamicum*, reaches the biosynthetic indigo yield of 685 mg/L (Ameria et al., 2015) in engineered *E. coli*. Mutants F170Y, A210G, A210S, and T326S cFMOs were fused with maltose-binding protein (MBP), and the fusion protein produced 1,040 mg/L indigo and 112 mg/L indirubin with 2.5 g/L tryptophan (Jung et al., 2018). While NiFMO from *Nitrincola lacisaponensis* has a comparably lower yield of indigo, it exhibits unique thermal stability, and the optimum catalytic temperature reaches 51 °C, which is about 8 °C higher than mFMO (Lončar et al., 2019a).

In summary, the biosynthesis of indigo using microorganisms has been proposed as an environmentally friendly strategy, and the discovery of mFMO has significantly improved the efficiency of heterologous biosynthesis of indigo. Various studies have been carried out to optimize the biosynthetic conditions and improve the properties of

the enzyme, which contributes to the development of efficient strategies for indigo production. A discussion of potential strategies to improve yields is included in the 3.4 subsection.

## 3.3 FMO-Catalyzed Biosynthesis of Indirubin

Utilizing the improved mFMO (Han et al., 2008), the biosynthetic pathway of indirubin was further studied. Cysteine was found to increase the selectivity of FMO for 2-hydroxyindole (Han et al., 2012), leading to a yield of 223.6 mg/L under optimum conditions. In 2022, a semi-rational design was applied and combined modification to the two regions (K223R/D317S) of FMO. Based on metabolic engineering technology, *E. coli* strains were screened to obtain high indirubin production, reaching the current maximum yield of 860.7 mg/L (Sun et al., 2022).

To reduce substrate costs in fermentation, researchers have employed mFMO and *E. coli* tryptophanase (TRP) to facilitate the biological synthesis of indirubin utilizing glucose as the primary substrate. As a result, a notable yield of 0.056 g/L of indirubin has been accomplished (Du et al., 2018).

**Table 3**. The summary of production of indigo/indirubin by FMOs

Year	Strategies	Genetic sources of FMO	Chassis	Plasmid/ Promoter	Production of indigo/indirubin (mg/L)	Supplements in culture	References
2003	First clone	Methylophaga	E. coli	pBlue 2.0	indigo: 160	2.00 g/L	Choi et al.,
2008	mFMO Gene sequence	sp. SK1 Methylophaga	DH5α E. coli	pBlue 1.7	indigo: 920	tryptophan 2.40 g/L	2003 Han et al.,

	and culture	aminisulfidivo	DH5α			tryptophan	2008
	optimization	rans MPT					
2011	Batch and continuous fermentation	Methylophaga aminisulfidivo rans MPT	E. coli DH5α	pBlue 1.7	indigo: 911 ± 22	2.00 g/L tryptophan	Han et al., 2011
2012	Cysteine influences the regioselectivity	Methylophaga aminisulfidivo rans MPT	E. coli DH5α	pBlue 1.7	indirubin: 223.6	2.00 g/L tryptophan, 0.36 g/L cysteine	Han et al., 2012
2015	First clone cFMO	Corynebacteri um glutamicum	E. coli WCO2	pMCF14	indigo: 685 indirubin: 103	2.50 g/L tryptophan	Ameria et al., 2015
2018	Site-directed mutagenesis	Corynebacteri um	E. coli WTS32	pK-T326 S	indigo: 1,040 indirubin: 112	2.50 g/L tryptophan	Jung et al., 2018
2018	Biochemical protecting group for dyeing	Methylophaga aminisulfidivo rans	E. coli MG165	pTMH56	indigo: 400	3.10 g/L tryptophan	Hsu et al., 2018
2020	Plant origin	Polygonum tinctorium	E. coli BL21	pET19b	indigo: 30	0.80 mM tryptophan	Inoue et al., 2021
2020	Fusion expression	Methylophaga sp. SK1	E. coli NEB10 β	pBAD	indigo: 1700	2.00 g/L tryptophan	Fabara and Fraaije, 2020
2021	Co-culture	Methylophaga aminisulfidivo rans MPT	E. coli	pCDFDue t-1	indigo: 104.3	5.00 g/L glucose or glycerol	Chen et al., 2021
2022	Structure-guide d enzyme engineering	Methylophaga aminisulfidivo rans MPT	E. coli BL21	pET28a	indirubin: 860.7	2.00 g/L tryptophan, 0.36 g/L cysteine	Sun et al., 2022
2023	Regulate the permeability of the cell membrane	Methylophaga aminisulfidivo rans	E. coli BL21	pCDFDue t-1	indigo: 1080	10.00 mM tryptophan	Ham et al., 2023
2023	Producing isobutanol and indigo together	Methylophaga aminisulfidivo rans	E. coli BL21	pETDeut-	isobutanol: 5800 indigo: 194.1	5.00 mM tryptophan	Cho et al., 2023

#### 3.4 Strategies for improving FMO-catalyzed biosynthesis

In 2023, silkworms were used to synthesize indigo, which opens a new avenue (Jia et al., 2023). Although researchers have achieved a yield of 1700 mg/L of indigo (Fabara and Fraaije, 2020), depending on tryptophan as the substrate and the lack of industrialization of indigo biosynthesis indicate the need of further improvements if we plan to use biotechnology as a substitute for the chemical method. Remodeling of FMOs, such as directed evolution and *de novo* design, holds promise for achieving higher yields. Additionally, few researchers have studied indigo biosynthesis using eukaryotes like yeasts as the chassis (Fig. 9A). To increase the yield of indigo synthesized by FMOs, several approaches can be pursued.

#### 3.4.1 Insights from FPMOs

To explore the potential of FMOs in indigo production, one effective approach is to examine studies on other enzyme families with similar mechanisms, such as flavoprotein monooxygenases (FPMOs).

Within the FPMO class B, which uses NADPH as a coenzyme, there are three subgroups, including FMOs, microbial N-hydroxylating monooxygenases (NMOs), and Baeyer-Villiger monooxygenases (BVMOs) (Paul et al., 2021; van Berkel et al., 2006). BVMOs can produce 0.031 g/L indirubin with 1 mM indole and 5 mM cysteine and convert indole to indigo only after specific mutations (Pazmiño et al., 2007; Catucci et

al., 2022). A mutant BVMO from *Acinetobacter radioresistens* (ArBVMO) with the R292A mutation can efficiently produce indigoids, with a k<sub>cat</sub> of 0.12 s<sup>-1</sup> for indigo production. It can synthesize 0.138 g/L indirubin from 5 mM indole and 5 mM cysteine, slightly lower than that of mFMO (Catucci et al., 2022). As cysteine enhances the selectivity of FMOs for indirubin production, ArBVMO is regulated in the same way, indicating that their structure of regulation is similar.

Styrene monooxygenase (SMO), which belongs to the FPMO class E, can convert tryptophan to indigo (Cheng et al., 2016; Pan et al., 2023). The maximum yield of indigo produced by SMO was up to 787.25 mg/L after 24 hours of fermentation with 2.0 g/L tryptophan as substrates (Pan et al., 2023). Further research on indigo production by different FPMOs is recommended, as the functional conservation between these enzymes offers potential for the *de novo* design in the future.

While there is little research on the random mutagenesis of FMOs, researchers have successfully redesigned several other monooxygenases, including SMOs (Tan et al., 2019) and cyclohexanone monooxygenases (CHMOs) (Zhang et al., 2019), resulting in significantly increased catalytic activity. For example, CHMO, a BVMO named for their natural substrate cyclohexanone, was performed both local and global protein engineering using two Casting libraries surrounding FAD<sup>+</sup> and NADP<sup>+</sup> prosthetic groups, as well as an error-prone PCR library of the full-length CHMO. This resulted in a 50-fold increase in activity compared to the previously best-performing variant

(Zhang et al., 2019). As the structure of mFMO resembles BVMOs in their coenzyme binding mode (Alfieri et al., 2008; Paul et al., 2021), it is possible that random mutagenesis could enhance the catalytic activity of mFMO and increase indigo production.

#### 3.4.2 Directed evolution

Although FMOs (EC 1.14.13.8) are of high interest in biotechnology due to their ability to catalyze various regioselectivity and stereoselectivity monooxygenation reactions (Catucci et al., 2017; Mitsubayashi and Hashimoto, 2000), natural enzymes have inherent limitations that restrict their industrial utilization in indigo production (Ameria et al., 2015; Choi, 2020; Ma et al., 2018; Rioz-Martinez et al., 2011). Therefore, in recent years, there has been an increasing number of publications focusing on enzyme engineering to improve enzymes' catalytic activity, specificity, regioselectivity, stereoselectivity, thermostability and solvent tolerance (Choi, 2020; Fabara et al., 2020; Linke et al., 2023).

Over the past two decades, many enzyme engineering strategies have been developed, with directed evolution being the most studied (Fig. 6) (Chowdhury and Maranas, 2020; Qi et al., 2022; Xiong et al., 2021). The concept of directed evolution is a natural evolution process through iterative cycles of genetic diversification followed by high-throughput screening or selection (Xiong et al., 2021). This concept emerged

early in 20th century and continued to develop in the 1990s. Three types of methods were identified for randomly generating mutants and *in vitro* recombination (Xiong et al., 2021). The first type is error-prone PCR, based on oligonucleotide mutagenesis (Cadwell and Joyce, 1992), which was first described in 1989 (Lenug D, 1989). The second type of methods is based on homologous recombination, including DNA shuffling (Kikuchi et al., 2000), staggered extension process (StEP) (Zhao et al., 1998), random priming *in vitro* recombination (RPR) (Shao et al., 1998), and random chimeragenesis on transient templates (RACHITT) (Coco, 2003). Finally, the third type of methods includes incremental truncation for the creation of hybrid enzymes (ITCHY) (Hu et al., 1997), random multi-recombinant PCR (RM-PCR) (Tsuji et al., 2001), and sequence homology-independent protein recombination (SHIPREC) (Sieber et al., 2001).

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In 2003, a mutant generation and clone screening approach was utilized with a flow cell optical rotation and a UV detector to engineer FMOs from *Oryctolagus cuniculus* (rFMO) and *Rhesus macaque* (rmFMO) for stereochemical preference control in the sulfoxidation of methyl p-tolyl sulfide. The engineered rFMO displayed up to 35% increased activity (Polyzos, 2003), meeting the demand. Furthermore, unspecific

peroxygenase (UPO, EC 1.11.2.1), a type of heme-thiolate enzyme with self-sufficient monooxygenase activity, can also catalyze the reaction from indole to indigo. The *Agrocybe aegerita* UPO1-encoding gene was subjected to directed evolution in *Saccharomyces cerevisiae*, and after five generations of evolution, nine mutations were screened, resulting in a 3250-fold activity improvement with no alteration in protein stability (Molina-Espeja et al., 2014). Additionally, after directed evolution, the half-life of a peroxidase (EC 1.11.1.16) increased from 3 to 35 minutes in the presence of 3000 equivalents of H<sub>2</sub>O<sub>2</sub> and with a 6 °C upward shift in thermostability (Gonzalez-Perez et al., 2014).

## 3.4.3 Semi-rational design of FMOs

Referring to enzyme engineering reviews (Xiong et al., 2021), semi-rational design strategy generates a mutation library on specific amino acid residues based on sequence and structural information of enzyme protein. This strategy avoids the time-consuming and labor-consuming process in directed evolution and has a convenient screening of suitable results. Semi-rational design strategy is based on two methodologies. In the sequence-based enzyme redesign method, critical conserved residues binding to substrate are identified through multiple sequence analysis of homologous protein sequences (Fig 5). In contrast, in the structure-based enzyme redesign method, the functional hot spots are pinpointed by analyzing substrate, transition state, or product

binding in the active site using docking results (Fig 4). Eventually, site-directed mutation and site-directed saturation mutation libraries are constructed and then screened for new functional enzymes.

To date, using site-directed mutagenesis, several studies have identified the role of amino acid residues associated with the structure and function of FMOs, accumulating a wealth of information on residue-function association (Wyatt et al., 1998). This information provides a valuable source for enzyme semi-rational design. For example, hFMO3 was researched through semi-rational design in different aspects. Numerous hFMO3 allelic variants were identified in patients and the 3D structural model of hFMO3 was generated by homology modeling, which was soon used to perform molecular dynamics simulations, followed by structural mapping of 12 critical polymorphic variants and molecular docking experiments with five different known substrates of hFMO3, giving insights into their binding mechanism (Gao et al., 2016).

A computational library design protocol named FRESCO is an structure-based enzyme engineering tool for stabilization (Wijma et al., 2018). In 2019, this protocol was first performed on cyclohexanone monooxygenase (EC 1.14.13.22), resulting in 128 screened point mutants. The most stable and highly active mutant displayed an increase in unfolding temperature of 13 °C and an approximately 33-fold increase in half-life at 30 °C (Fürst et al., 2019a). Then, after discovering the thermostable NiFMO (Lončar et al., 2019a), FRESCO was utilized to improve its thermostability. After

screening a relatively small number of enzyme mutants, the k<sub>cat</sub> for indole was improved by 1.5-fold (Lončar et al., 2019b). Furthermore, in 2022, the catalytic efficiency of bFMO, cloned from *Methylophaga aminisulfidivorans*, was enhanced by 6.6-fold using FRESCO (Sun et al., 2022). Moreover, a recent study engineered mFMO for industrial application using the Protein Repair One-Stop Shop (PROSS) algorithm (Goldenzweig et al., 2016; Peleg et al., 2021; Wijma et al., 2018) and successfully redesigned a mutant with the ability to reduce TMA levels in a salmon protein hydrolysate at industrially relevant temperatures (Goris et al., 2023).

Further improvements could be made to FMOs in their industrial utilization for producing indigo. In 2016, a study combining structural analysis and sequence alignment successfully switched the cofactor preference of type I BVMOs from NADPH to NADH (Beier et al., 2016). As NADH cofactor is preferred for industrial purposes, this redesign could be a promising future project to apply to FMOs to acquire better industrial properties.

## 3.4.4 De novo enzyme design with high substrate specificity

Recently, the limitations of directed evolution or semi-rational design strategies have become apparent due to their mutation rates, making it difficult to satisfy stability or specific activity needs for certain applications. *De novo* protein design is an emerging method for enzyme engineering that can generate a sequence based on the given

structure (Chen et al., 2022; Wang et al., 2023; Xiong et al., 2021). Computational physics-based tools for *de novo* design, such as dynamics simulation and optimizing sequences based on a given structure (Ferreira et al., 2022), can highly assemble naturally existing enzymes. Additionally, AI tools for protein design, which can generate *de novo* motifs or "hallucinate" a compatible structure based on the input structure backbone (Anishchenko et al., 2021), have become a new trend in life science (Ding et al., 2022; Kim et al., 2021; Liu and Chen, 2022; Yang et al., 2023). It is worthwhile to describe some of the most exciting tools that have been developed in recent years and their powerful potential applications in the industrialization of FMOs.

De novo design strategies have rapidly developed through energy computing and the development of protein modeling (Wang et al., 2023; Woolfson, 2021). There are two types of protein modeling mechanisms, which are correlated to different tools. The first type is the template-based protein modeling, which is based on multiple sequence alignment (MSA) and residue-residue interaction (RRI) data. Some successful AI-based programs in this category include AlphaFold-2, RoseTTAFold, and I-TASSER. The second type is non-template-based protein modeling, which used methods of Monte Carlo (MC) or Markov Chain Monte Carlo (MCMC) simulations to get the protein to fold into its energy-minimized state.

Introductions for bioinformatics tools developed for *de novo* enzyme design are shown in Table 4, such as RoseTTAFold (Wang et al., 2022), Message-Passing Neural

Network (MPNN) (Dauparas et al., 2022), RFdiffusion (Watson et al., 2023), and Family-wide hallucination (Yeh et al., 2023). Each tool has its own advantages and limitations.

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**Table 4**. The summary of various *de novo* design tools

Protein design tools	Input	Function	Advantages	Shortcomings	Remarks	References
			1. Protein structure pre	diction		
AlphaFold2	Protein sequences (MSA)	Deep learning-based protein structure prediction	High accuracy	High computational resource requirements; 2.  Limited accuracy; 3.  Cannot predict novel structures	As a baseline model for protein structure prediction, the model is modified for protein design.  Introduce energy	Jumper et al., 2021
RoseTTAFold	Protein sequences	Deep learning-based protein structure prediction		1. Limited to specific issues; 2. Energy function limits	function to consider the rationality of protein structure, variant tools based on specific tasks can be flexibly applied to protein design	Wang et al., 2022
trRosettaX2	Protein sequences (MSA)	Deep learning-based protein structure prediction	More accurate than AlphaFold2	Multimer structure prediction	Monomer and Multimer structure predictions were ranked at the top and fourth in CASP15	Peng et al., 2023
ESMFold	Protein sequences	Deep learning-based protein	1. Protein-specific prediction; 2. Faster than MSA-based solutions	Less accurate than AlphaFold2	A model based on information extracted from	Weissenow et al., 2022

D-I-TASSER	Protein sequences (MSA)	structure prediction  Template-base d protein structure prediction		Not satisfied with multi-domain protein modeling	protein language models might be better for protein design than those based on MSAs A model based on the threading method. The server can perform both template-based and template-free	Zheng et al., 2021
					modeling	
			2. Physics-based protein	n design		
TopoBuilder	Ideal secondary structure elements (SSEs) and epitope Coordinates,	Backbone generation	Can construct and design any protein form description	Limits to the guidance of natively arranged SSEs	A fragment-based method works as an extension of the Fold Form Loops protocol	Harteveld et al., 2022
SEWING	sequences, and connectivity information for a set of substructures from native	Backbone generation	<ol> <li>Rapidly generate large numbers of scaffolds; 2.</li> <li>Advantageous for functional design.</li> </ol>		Perform structural extension with native-substructu re graphs	Guffy et al., 2018
AbDesign	protein Protein structures of selected protein family	Backbone generation	Large-scale assembly		De novo backbone design by assembling local structures A method that	Lipsh-Sokol ik et al., 2021
HBNet	Backbone structure	Protein design	Hydrogen-bond networks design		calculates cooperative hydrogen bonding networks should	Boyken et al., 2016

				be broadly useful	
				in enzyme	
				design	
				A multistate	
			1. Sequence design	design method	
Meta-multistat	Backbone	Sequence	considering	could be used to	Davey et al.,
e design	structure	optimization	conformationally	design	2017
C		1	dynamic state; 2. Large	multisubstrate	
			ensemble size	enzymes	
			1. Many completely	A powerful suite	
		Protein	Rosetta-based protocols	of programs for	Leman et
Rosetta		modeling and	exist; 2. Various web	de novo protein	al., 2020
		design	servers	design	,
				Perform different	
			Integrate many	functions with	Pantazes et
IPRO		Protein design	computational protein engineering methods	different	al., 2015
				modules	
				Use a	
			With various functions	physics-based	
o apperi	Protein structure	Protein modeling and design	related to protein design	energy function	Hallen et
OSPREY			based on GPU	that combines	al., 2018
			acceleration	both Amber and	
				CHARMM	
	Natural			A suite of <i>de</i>	
	protein			novo	
ISAMBARD	structures or	or Energy	User friendly	biomolecular	Wood et al.,
ISAMBARD	backbones depend on the	prediction		design tools	2017
				using BUFF	
	approaches			energy function	
				The main	
		Molecular		characteristic of	
		mechanics	1. User friendly; 2.	this package is	
	Protein	(MM) and	Interoperable with other	its modularity	Rackers et
Tinker	structure	molecular	tools and access to	and has	al., 2018
	structure	dynamics	many force fields	developed a few	ai., 2016
		(MD)	many force fields	branches like	
		simulations		Tinker-HP and	
				Tinker-OpenMM	
	Support for	Protein		Based on	Eastman et
OpenMM	multiple input	dynamics	rnamics High extensibility	extensibility in	al., 2017
	pipelines	simulation		every layer of	a1., 201/

				the architecture,	
				users can easily	
				add new features	
				like novel	
				functional	
				formed forces or	
				new simulation	
				protocols	
				Support	
				simulations	
				including	
				leap-frog Verlet,	
				velocity Verlet,	
				Brownian, and	
	Protein structure	Protein	1. Fast; 2. Various	stochastic	
GROMACS		Protein dynamics simulation	simulations; 3. Able to	dynamics, as	Abraham et
GROWACS			scale the largest	well as	al., 2015
			machines in the world	calculations that	
				do energy	
				minimization,	
				normal-mode	
				analysis, and	
				simulated	
				annealing	
		Homology		Can be used as a	
		modeling, energy minimization, docking, and molecular		molecular	
			User-friendly with a	dynamics	Land and
YASARA			built-in graphical	refinement for	Humble,
			interface	Rosetta to	2018
				broaden the	
		dynamic		substrate scope	
		simulations		Used in the	
				DSDBASE2.0	
				database on	
				native and	
MODIP	Protein	Disulfide	Depends on database	modeled	Kalmankar
MODIF	sequence	ce bond design	Depends on database	disulfides to	et al., 2022
				identify pairs of	
				residues that	
				form disulfide	

PROPKA	Protein structure	protonation states prediction			bonds A model focuses on the prediction of ligand $pK_a$ values	Søndergaard et al., 2011
MaSIF	Database of known protein structure and protein binding surface information	Protein interaction analysis	The target protein can be searched directly across the mechanism of protein-protein interaction.	1. The conformation of the designed protein is inflexible; 2. The antimutagenicity is not considered; 3. It depends on the binding surface seed bank; 4. The functional goal is single and needs artificial screening and optimization.	Techniques from the field of geometric deep learning are introduced to resolve information encoding protein interaction interfaces	Gainza et al., 2023
		3	3. Statistics-based de nov	vo design		
ProteinMPNN	Coordinates of protein (polymer)	Protein design	1. short calculation time; 2. Able to design new proteins with few restrictions	Computational     requirements; 2.     Hardware memory     limitations	For the design of monomeric protein design, the Monte Carlo optimization algorithm and the hallucination strategy are combined, and the loss function is used to ensure the consistent stability of protein folding and assembly.	Dauparas et al., 2022
PoPMuSiC	Protein structure	Energy prediction	<ol> <li>Rapid computation of stability changes induced by single-site mutation; 2. Good prediction performance;</li> <li>User friendly</li> </ol>		Use the statistical energy functions extracted from empirical data	Dehouck et al., 2011
Autodock	Protein structure	Docking	Molecular interactions		A suite of toolkits for	Goodsell et al., 2021

	(with ligand)			various	
				computational	
				ligand docking	
				that has	
				developed over	
				30 years	
				Use a	
				surface-based	
				molecular	
	Protein		Superior in predicting	similarity search	
Surflex-Dock	structure	Docking	the binding mode and	engine to rapidly	Jain, 2003
	(with ligand)		binding score	generate a	
				suitable	
				conformation	
				and alignment	
		Cofactor		Perform the	
CSR-SALAD	Protein	specific	User friendly	switch between	Cahn et al.,
CSK-SALAD	structure	switch		NAD and NADP	2018
		analysis		cofactors	
				Combine a	
				statistical energy	
			No boundary of	function with	
	Backbone	Energy	homology between	van der Waals	Xiong et al.,
ABACUS	structure	prediction	design targets and	energy terms to	2017
		1	training proteins	search stable	
				sequences for a	
				given backbone	
		_		structure	
	Structure	Deep		Find the most	
p cpp	(atom	learning-based	Quick and convenient	suitable	Qi and
DenseCPD	distribution	protein	to generate de novo	sequences for the	Zhang, 2020
	information)	sequence	sequence	protein backbone	
		design		The and a sign of	
	Protein		1 Pattar consection of	The extension of the	
	structure	Deep	1. Better generation of diversity; 2. Potential to	RoseTTAFold	Watson et
RFdiffusion	coordinates	learning-based	solve complex	variant tool in	al., 2023
	with Gaussian	with Gaussian protein design	problems	the generative	a1., 2023
	noise		problems	diffusion model	
				diffusion model	

ProtGPT2	Protein sequence	Deep learning-based protein design	Discover new proteins	<ol> <li>Computational requirements;</li> <li>Hardware memory limitations</li> </ol>	Application of GPT2 deep language model	Ferruz et al., 2022
ProteinSGM	Image-like representation s of protein structures	Deep learning-based protein design		1. Computational requirements; 2. Cannot analyze inter-chain interactions	Applications of diffusion models and the continuous-time SDE framework	Lee et al., 2023

RoseTTAFold, developed by David Baker laboratory, is a protein structure prediction tool that can be used for designing proteins with specific functions. It is based on two schemes (Fig. 7) (Wang et al., 2022): (1) constrained hallucination (trRosetta or RoseTTAFold) to optimize known functional protein sequence and (2) inpainting (RF<sub>joint</sub>) to optimize and fill the gaps between two sequences to ensure a reasonable final synthesized protein structure.

Unlike energy optimization-based structure prediction tools such as RoseTTAFold and AlphaFold 2, MPNN (Dauparas et al., 2022) predicts and generates candidate protein sequences for the basic protein skeleton. This tool is useful for oligomers and protein-protein binding application, as it can ensure the formation of binding forms between protein skeletons without blindly pursuing the goal of the lowest energy.

Researchers have developed RFdiffusion (Watson et al., 2023), a new protein

design diffusion model that combines protein structure prediction methods with an in-depth understanding of protein structure. By using Fine-tuning RoseTTAFold as a denoising network in Denoising Diffusion Probabilistic Models (DDPMs), RFdiffusion can generate a variety of design protein skeletons. Through a multi-step denoising process, a design protein skeleton is gradually produced. The MPNN is then used to generate the protein sequence with the desired structure.

-----Fig 7-----

A deep-learning-based 'family-wide hallucination' approach was used to design artificial luciferases with a much higher substrate specificity than native luciferases (Yeh et al., 2023). Based on the successful examples of *de novo* design (Wicky et al., 2022), it is possible to design a new thermostable enzyme that can specifically catalyze indole and form homomultimers. One approach could be using deep network hallucination to generate a wide range of symmetric protein homo-oligomers, specifying the basic number of symmetric units and the length of the oligomer. Then, structure prediction and MPNN could be used to optimize the protein sequence to obtain a "convergent" protein sequence. One approach is Molecular Surface Interaction Fingerprinting (MaSIF) (Gainza et al., 2023), which could be used to predict the protein binding site and encode the protein binding interface to obtain the fingerprint

information of the binding interface. With the help of the binding interface fingerprint, the seeds of complementary binding motifs could be generated in the database, and the obtained seeds could be further optimized to obtain the designed protein structure. One approach could start from the natural sequence, carry out Monte Carlo search in the sequence space, and apply trRosetta structure prediction neural network to score the confidence of the predicted structure. By combining these methods, it may be possible to design a new enzyme that meets the desired specifications.

#### 3.4.5 The immobilization of FMOs

To meet the economic requirements for enzyme usage, researchers have explored the utilization of immobilized FMOs (Fig. 8). This has been achieved by immobilizing FMOs on silica nanospheres (Biradar et al., 2010) or magnetic nanoparticles (Ramana et al., 2017). Immobilizing at the C-terminal (membrane anchor region) of hFMO3 has been shown to significantly improve its enzymatic thermostability (Gao and Zheng, 2019).

FMOs on electrodes have been studied, immobilized through dialysis or entrapment in a gel cross-linked with bovine serum albumin and glutaraldehyde (Castrignanò et al., 2010). These immobilized FMO electrodes have been used as biosensors for detecting drug and microelements in electrochemistry (Mitsubayashi and Hashimoto, 2000; Mitsubayashi and Hashimoto, 2002; Saito et al., 2008). Different methods of

immobilization have been studied, and immobilization on the gold surface has been found to be more effective in catalysis (Ferrero et al., 2008; Sadeghi et al., 2011; Sadeghi et al., 2010). The electrochemical response of the GC/DDAB/hFMO3 electrode was enhanced using graphene oxide (Castrignanò et al., 2015; Sadeghi et al., 2010).

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## 3.4.6 Regenerating NADPH in FMO catalysis

In the catalytic cycle of FMOs, the flavin cofactor is reduced by NADPH to initiate subsequent reactions (Eswaramoorthy et al., 2006). However, in extracellular enzyme reaction systems or recombinant cells, the rate of NADPH regeneration may limit the overall reaction rate. By fusing dehydrogenase with FMOs or constructing recombinants to express these enzymes, researchers have utilized different dehydrogenases for NADPH recycling to overcome this limitation (Doukyu et al., 2003; Rioz-Martinez et al., 2011). The choice of dehydrogenase is based on the substrates catalyzed to refill NADPH, such as phosphite, ethanol, and malate (Pan et al., 2023). The usual function of the FMOs-dehydrogenase dimers for NADPH-regeneration is to supply NADPH or NADH in a catalytic environment that lacks them, such as in organic solvents (Doukyu et al., 2003), where there are abundant organic substrates.

### 3.4.7 Metabolic engineering

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In the post-genomic era, metabolic engineering has made significant advancements with the aid of genome-scale metabolic network models (GEMs) (Fig. 9B), which represent cellular metabolism mathematically and encompass known chemical reactions, metabolites, associated genes (Orth et al., 2010; Thiele and Palsson, 2010). GEMs can be refined and enhanced through the integration of multi-omics data such as transcriptomics (Colijn et al., 2009; Jensen and Papin, 2011; O'Brien et al., 2013; Ravi and Gunawan, 2021), proteomics (Chen et al., 2021; Dahal et al., 2020; Yizhak et al., 2010), and metabolomics (Filippo et al., 2022; Siddiqui et al., 2018; Yizhak et al., 2010). GEMs have been established as a standard platform for analyzing E. coli's metabolism (Fang et al., 2020), and numerous studies have utilized these models for the engineering of *E. coli* to enhance the production of bioproducts. Guided by GEMs, E. coli was successfully engineered to improve anaerobic functionality of the oxidative tricarboxylic acid cycle, thereby effectively generated the necessary reducing power to facilitate the biosynthesis of 1,4-butanediol (Yim et al., 2011). The flux of central and aromatic amino acid biosynthesis reactions was predicted by in silico response analysis of E. coli GEM (Yang et al., 2018), which showed a negative correlation between flux and the synthesis rate of D-phenyllactic acid. And knocking them out could enhance the production of aromatic polymers involving D-phenyllactic acid as a monomer.

Metabolic modifications had been used in some indigo biosynthesis research (Berry et al., 2002). However, there is still much potential for the utilization of GEMs in indigo and indirubin biosynthesis. This could lead to a more rational approach to metabolic engineering and further enhance the yield of these valuable compounds.

### 3.4.8 Fermentation engineering

Modern fermentation engineering integrates novel technologies such as fermentation process optimization, amplification, and precise control technology with traditional fermentation engineering, which magnificently improve the production. Optimization of composition in culture medium and coenzyme recycle is attempts to increase production of indigo aside from the endeavor in metabolic engineering.

The toxicity of indole has been shown to decrease indigo production of the producer microorganisms (Murdock et al., 1993; O'Connor et al., 1997). To address this issue, a two-phase culture system was constructed comprising organic solvent-tolerant microorganisms and non-aqueous media, which enriched indole in the hydrophobic organic solvent and reduced its concentration in the medium (Fig. 9C) (Doukyu et al., 2003). Methyl tert-butyl ether and cyclopentyl methyl ether have been found to be the best organic media for a type II flavin-containing monooxygenase (FMO-E) catalysis and a horse liver alcohol dehydrogenase (HLADH) mediated NADPH regeneration (Huang et al., 2019). Coenzyme regeneration systems have also been designed to

recycle NAD(P)H when applying FMOs in non-aqueous media (Doukyu et al., 2003; Huang et al., 2019).

Following cloning mFMO, the production of bio-indigo was optimized using a response surface methodology with a two-level central composite design to demonstrate the interactions between different pairs in the following three factors: tryptophan, yeast extract and sodium chloride, resulting in a 575% increase in production (Han et al., 2008). Large-scale fermentations were also conducted to validate the application potential of FMOs (Han et al., 2011).

# -----Fig 9-----

#### 4. The role of FMO in health and disease

TMA is a volatile tertiary amine derived from daily diet. It is primarily produced in the colon, absorbed into the bloodstream, and converted into trimethylamine oxide (TMAO) in the liver by hFMO3 (Fennema et al., 2016). FMO deficiency or excessive TMAO production is associated with various chronic diseases, such as kidney and coronary artery diseases. FMO plays a crucial role in TMA oxidation and is therefore considered a potential therapeutic target for these diseases.

Trimethylaminuria (TMAU) is a genetic disorder caused by a defect in hFMO3.

Individuals affected by TMAU have a severely reduced ability to convert TMA into

TMAO, leading to the accumulated TMA that is excreted through sweat, breath, urine, and other bodily fluids. This causes an unpleasant odor resembling rotten fish (Schmidt and Leroux, 2020), which can harm individuals' psychological well-being. Gene therapy targeting hFMO3 is a promising method for treating TMAU, but limited research data is available (Donato et al., 2021). Additionally, detecting hFMO3 mutations is critical for diagnosing TMAU and expanding the corresponding gene mutation data to promote functional genomics research and explain the disease's pathogenesis. Despite numerous sequencing studies on samples of TMAU worldwide, there is limited research on the association between mutations and the loss of function of hFMO3 (Ameria et al., 2015). In 2021, modeling analysis and experimental verifications were conducted on some hFMO3 mutations considered to be polymorphic or benign. The results suggested that these mutations might damage FMO dynamics, but the causal relationship between these mutations and the pathogenic mechanism could not be confirmed. TMAO is an atherogenic metabolite that affects platelet reactivity and thrombosis

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TMAO is an atherogenic metabolite that affects platelet reactivity and thrombosis potential. Excessive TMAO production can impose a burden on the cardiovascular system (Janeiro et al., 2018; Senthong et al., 2016; Tang et al., 2019; Xu and Yang, 2021). Targeting metabolic pathways associated with TMAO may be a feasible method for treating atherosclerosis (Yang et al., 2019). TMAO has become an essential pathogenic factor and therapeutic target for treating coronary heart disease. Recent studies have shown that skin fibroblasts, vascular endothelial cells, and adipocyte

progenitors are reprogrammed into myofibroblasts through the TMA-FMO-TMAO-PERK pathway, leading to systemic sclerosis syndrome caused by intestinal dysregulation (Kim et al., 2022). hFMO3, the key enzyme in this pathway, is a potential therapeutic target for specific regulation of its association with upstream chemicals (Zhu et al., 2018).

#### **5. Conclusions**

The studies related to FMOs and biosynthesis have a long history, spanning over 50 years since the discovery of FMO from pig liver in 1972. The emergence of indigo biosynthesis was in 1989. And the first report of indigo biosynthesis by mFMO was published in 2003. FMOs exhibit some variations across species. In human, hFMOs are located at the ER of hepatocytes towards the cytoplasm, while in bacteria, mFMO is water-soluble. The structures and catalytic mechanisms of FMOs have been extensively studied, and FMOs are increasingly recognized for their crucial roles in biosynthesis, biosensors, diseases, and drug metabolism due to the broad substrate specificity. New biotechnologies, such as directed evolution, *de novo* design, and GEMs, can be used to further improve the yield of FMOs. However, there are still many challenges and questions that need to be addressed. This review aims to provide insights to scientists, who can use this information to further explore the potential of FMOs in various fields.

- 749 **Abbreviations**
- 750 AncFMO: ancient mammalian FMO
- 751 ArBVMO: BVMO cloned from Acinetobacter radioresistens
- 752 bFMO: FMO cloned from Methylophaga aminisulfidivorans
- 753 BVMOs: baeyer-villiger monooxygenases
- 754 CFA: cyclopropane fatty acid
- 755 cFMO: FMO cloned from Corynebacterium glutamicum
- 756 CHMOs: cyclohexanone monooxygenases
- 757 CYP450: cytochrome P450
- 758 DDAB: didodecylammonium bromide
- 759 DDPMs: denoising diffusion probabilistic models
- 760 DMS: dimethylsulfate
- 761 DMSO: dimethylsulfoxide
- 762 DTME: dithio-bismaleimidoethane
- 763 ER: endoplasmic reticulum
- 764 FAD: flavin adenine dinucleotide
- 765 FMOs: flavin-containing monooxygenases
- 766 FMO-E: type II flavin-containing monooxygenase cloned from *Rhodococcus jostii*
- 767 RHA1
- 768 FMO6p: flavin containing dimethylaniline monoxygenase 6, pseudogene
- 769 FPMOs: flavoprotein monooxygenases
- 770 GC: glassy carbon
- 771 GEMs: genome-scale metabolic network models
- 772 hFMO: human flavin-containing monooxygenase
- 773 HLADH: horse liver alcohol dehydrogenase
- 774 IAA: indole-3-acetic acid
- 775 IPyA: indole-3-pyruvate acid

- 776 ITCHY: incremental truncation for the creation of hybrid enzymes
- 777 MaSIF: molecular surface interaction fingerprinting
- 778 MBP: maltose-binding protein
- 779 MC: monte carlo
- 780 MCMC: markov chain monte carlo
- 781 mFMO: FMO cloned from *Methylophaga sp.* strain SK1
- 782 MPNN: message-passing neural network
- 783 MSA: multiple sequence alignment
- NADPH: nicotinamide adenine dinucleotide phosphate
- 785 NiFMO: FMO cloned from *Nitrincola lacisaponensis*
- 786 NMOs: N-hydroxylating monooxygenases
- 787 pFMO: pig flavin-containing monooxygenase
- 788 PROSS: protein repair one-stop shop
- 789 PTDH: phosphate dehydrogenase
- 790 PtFMO: FMO cloned from *Polygonum tinctorium*
- 791 RACHITT: random chimeragenesis on transient templates
- 792 rFMO: rabbit FMO
- 793 rmFMO: FMO cloned from *rhesus macaque*
- 794 RM-PCR: random multi-recombinant PCR
- 795 RPR: random priming *in vitro* recombination
- 796 RRI: residue-residue interaction
- 797 SHIPREC: sequence homology-independent protein recombination
- 798 SMFMO: FMO cloned from S. maltophilia
- 799 SMO: styrene monooxygenase
- 800 SNPs: single nucleotide polymorphic variants
- 801 StEP: staggered extension process
- 802 TMA: trimethylamine

803	TMAO: trimethylamine oxide
804	TMAU: trimethylaminuria
805	TMM: trimethylamine monooxygenase
806	TRP: tryptophanase
807	UPO: unspecific peroxygenase
808	6BrIG: 6,6'-dibromoindigo
809	
810	CRediT authorship contribution statement
811	Changxin Fan: Conceptualization, Formal analysis, Investigation, Writing - Original
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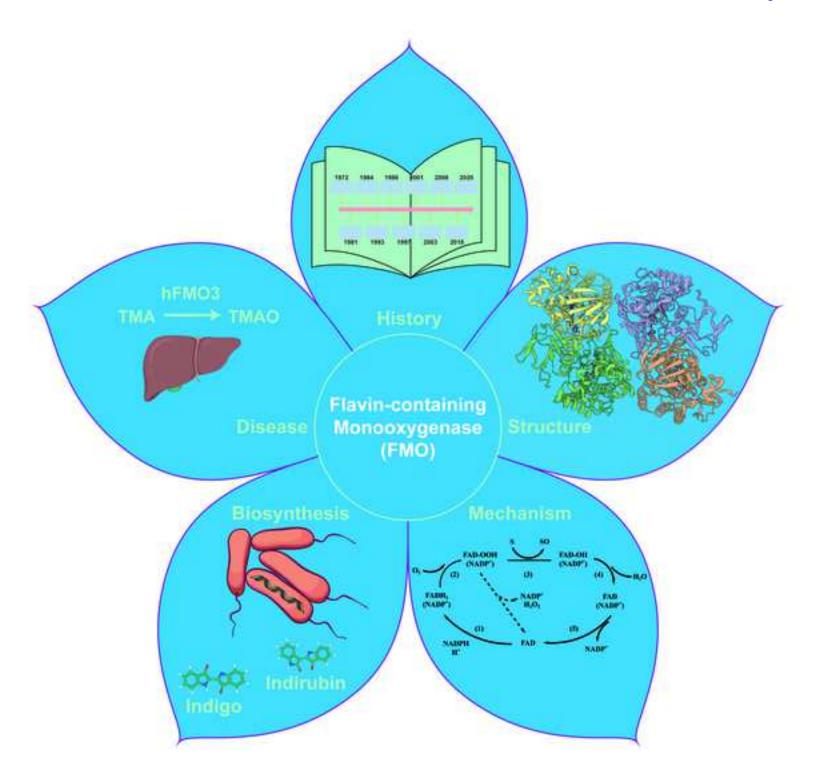
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## **Captions**

**Figure 1.** The timeline of research history about FMO and its application to indigo biosynthesis (A) Crucial time points in the research history of FMO (B) Crucial time points in indigo biosynthesis with FMO.

Figure 2. Sequence alignments of FMOs across various species. (A) The consensus sequences of *Homo sapiens* FMO3 (hFMO), *ancient mammalian* FMO (ancFMO3-6), *Methylophaga* sp. strain SK1 FMO (mFMO), *Schizosaccharomyces pombe* FMO (spFMO), *Corynebacterium glutamicum* FMO (cFMO), and *Nitrincola lacisaponensis* FMO (NiFMO) were identified. The putative FAD, FMO-identifying motif, and NADPH pyrophosphate binding domain are colored blue. Some active sites are colored with ClustalX. The alignment was performed with ClustalW, Jalview, and ESPript (B) Protein sequence identity (%) between different FMOs.

Figure 3. The structure of AncFMO3-6. (A) The cartoon of homo-dimer AncFMO3-6 (PDB ID: 6se3.1) is exhibited from the front perspective. Pale cyan: Rossmann fold for FAD, 2-154 AA (Amino acids), 331-442 AA. Light blue: Rossmann fold for NADP(H), 155-213 AA, 296-330 AA. Orange: the ridged triangular fold, 214-295 AA. Green: 443-507 AA. Pale green: 510-532 AA. Pale yellow: FAD. Light pink: NADP(H). Red: oxygen; (B) The ridged triangular fold and the catalytic cavity are exhibited from the front perspective. The black arrow points to the catalytic cavity; (C) The tunnel is exhibited from the bottom perspective (left) and upper perspective (right). The black dotted line means the connected surface of homo-dimer AncFMO3-6. The black arrows point to the tunnel and the catalytic cavity; (D) The

mesh of amino acids which form hydrogen bonds with NADP(H) and FAD; (E) The amino acids (S13, E32, R33, L40, W41, R51, T60, N61, S62, V110, and T378) form hydrogen bonds with FAD; (F) The amino acids (F59, N61, L192, N194, S195, S216, E281, and Q373) form hydrogen bonds with NADP(H).

**Figure 4**. The structure and catalytic mechanism of mFMO. (A) The cartoon of homo-dimer mFMO (PDB ID: 2vq7) is exhibited from the front perspective. Pale cyan: Rossmann fold for FAD, 1-169 AA and 281-461 AA. Light blue: Rossmann fold for NADP(H), 170-280 AA. Pale yellow: FAD. Light pink: NADP(H). Pale green: three loops, 44-80 AA, 166-186 AA, and 276-306 AA; (B) The catalytic cavity is exhibited from the front perspective. The black arrow points to the catalytic cavity; (C) The three loops are exhibited linking the binding domains of NADP(H) and FAD; (D) Y212 protects the catalytic cavity from the solvents (E) The catalytic mechanism of FMOs. The sulfur atom is regarded as the substrate.

**Figure 5**. The docking result of indole and mFMO via AutoDock. (A) The cartoon of mFMO (PDB ID: 2vq7) with indole (Compound CID: 798) is exhibited from the front perspective. Pale cyan: Rossmann fold for FAD, 1-169 AA and 281-461 AA. Light blue: Rossmann fold for NADP(H), 170-280 AA. Pale yellow: FAD. Light pink: NADP(H). Pale green: three loops, 44-80 AA, 166-186 AA, and 276-306 AA. Green sticks: indole. Yellow dotted line: hydrogen bonds; (B) The surface model of mFMO with indole. Light blue dots: Tyr212 (C) The mechanism of indigo biosynthesis.

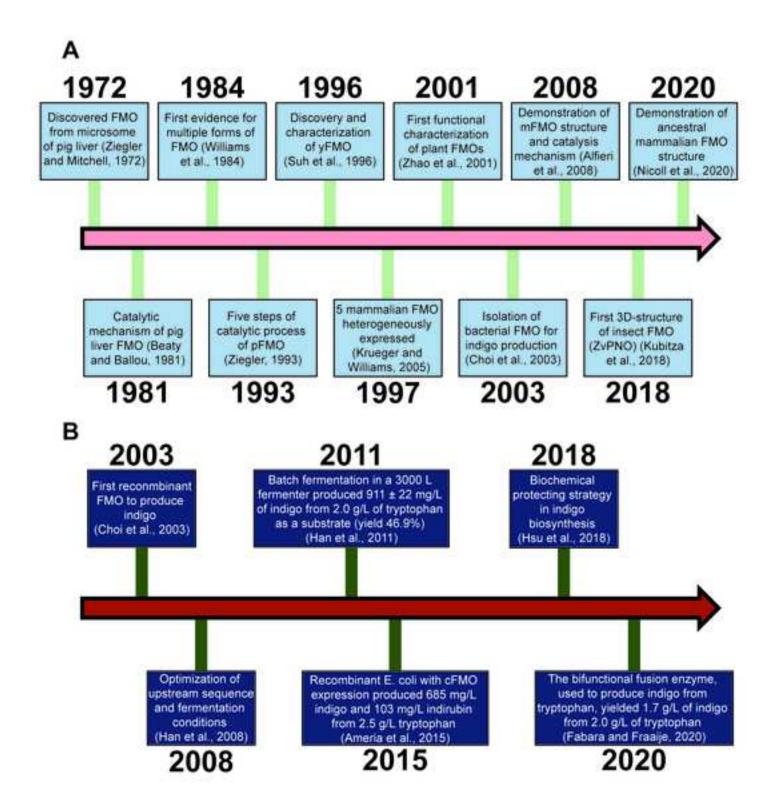
**Figure 6.** The sketch map of directed evolution to improve indigo biosynthesis via FMOs.

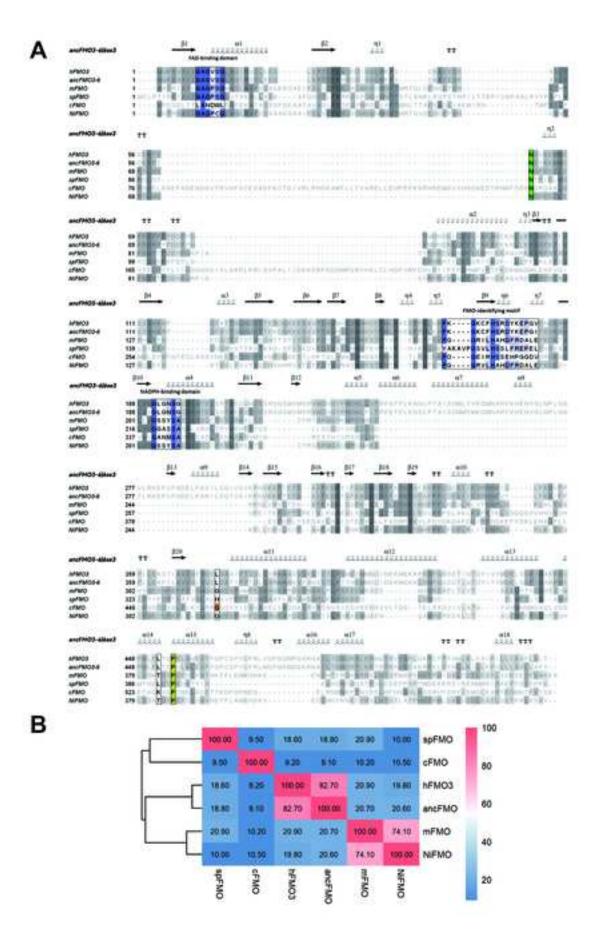
**Figure 7.** Demonstrations of some *de novo* design methods. (A) Active center design for enzymes and protein binders; (B) Sketch maps of some AI-based tools for protein scaffold design, including hallucination, inpainting, and MPNN; (C) Validation techniques for *de novo* design proteins.

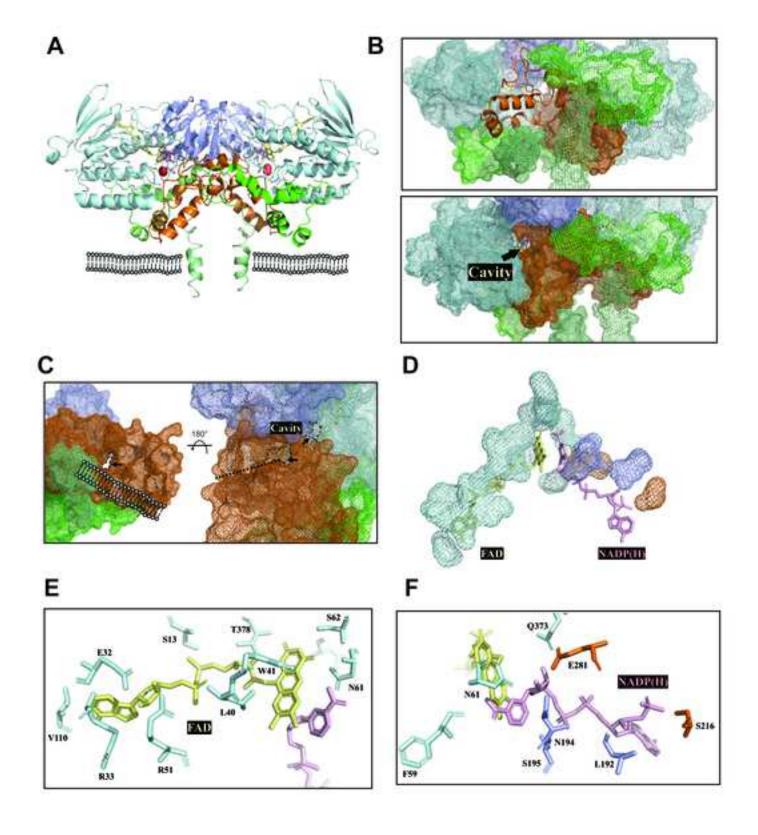
Figure 8. Various methods of FMOs immobilization. (A) FMOs were adsorbed by support materials; (B) FMOs formed covalent bonds with support materials; (C) FMOs were cross-linked by a cross-linking agent; (D) FMOs were entrapped within a polymeric network; (E) FMOs were enclosed in a spherical semipermeable membrane; (F) FMOs were immobilized on graphene oxide (GO). Didodecyldimethylammonium bromide (DDAB) played as an interface between GO and FMOs. FMOs-DDAB-GO was on glassy carbon (GC) electrodes.

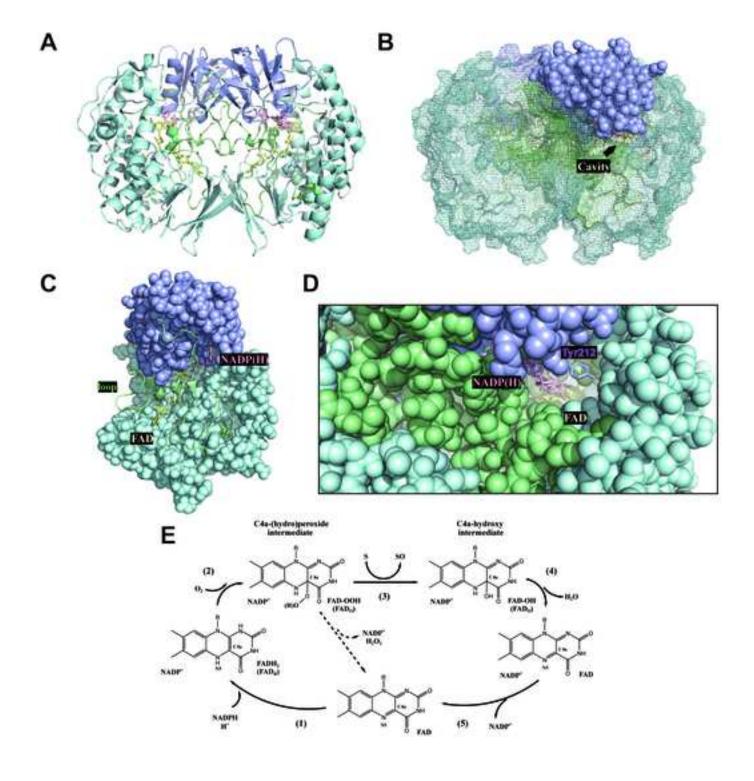
**Figure 9.** Metabolic and fermentation engineering to improve biosynthesis of FMOs.

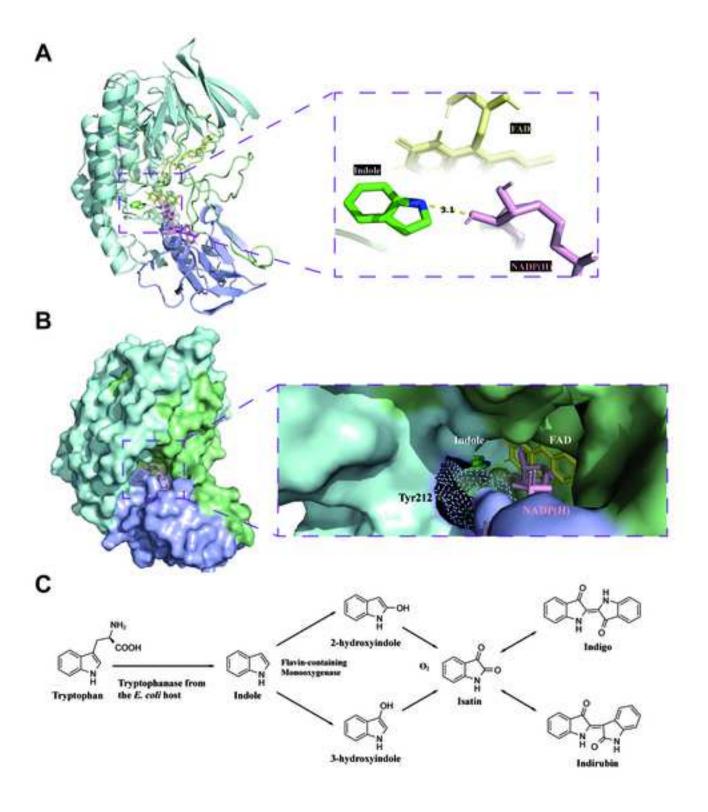
(A) A suitable chassis should be chosen for further improvements; (B) The establishment and application of genome-scale metabolic network models (GEMs); (C) Optimization in fermentation engineering to increase the production of indigo biosynthesis.

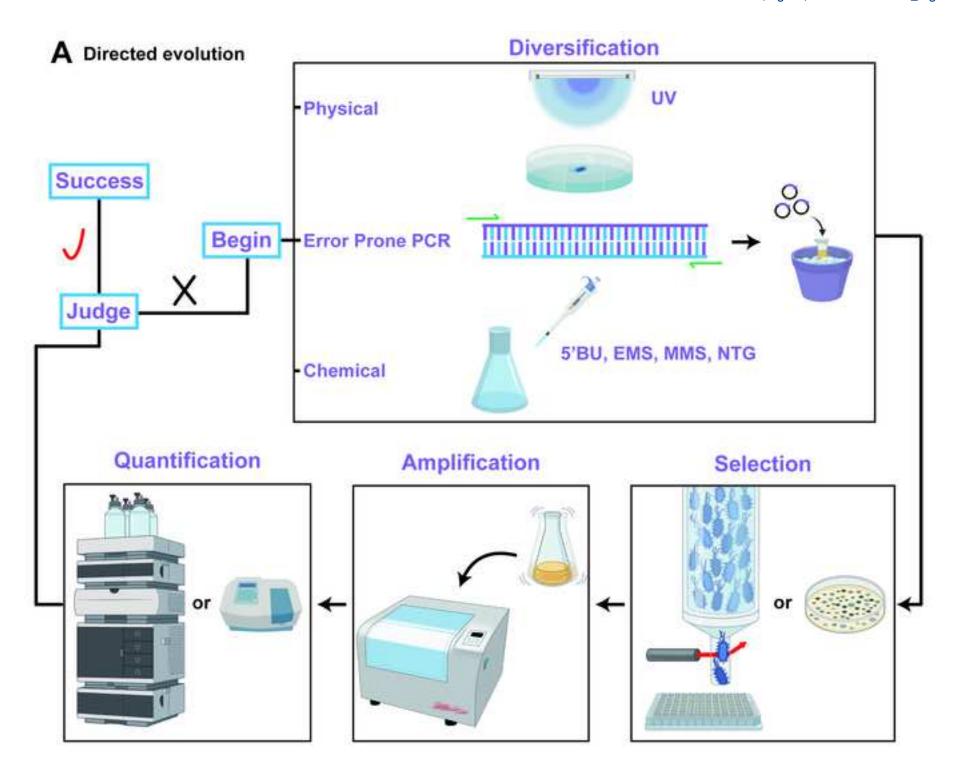


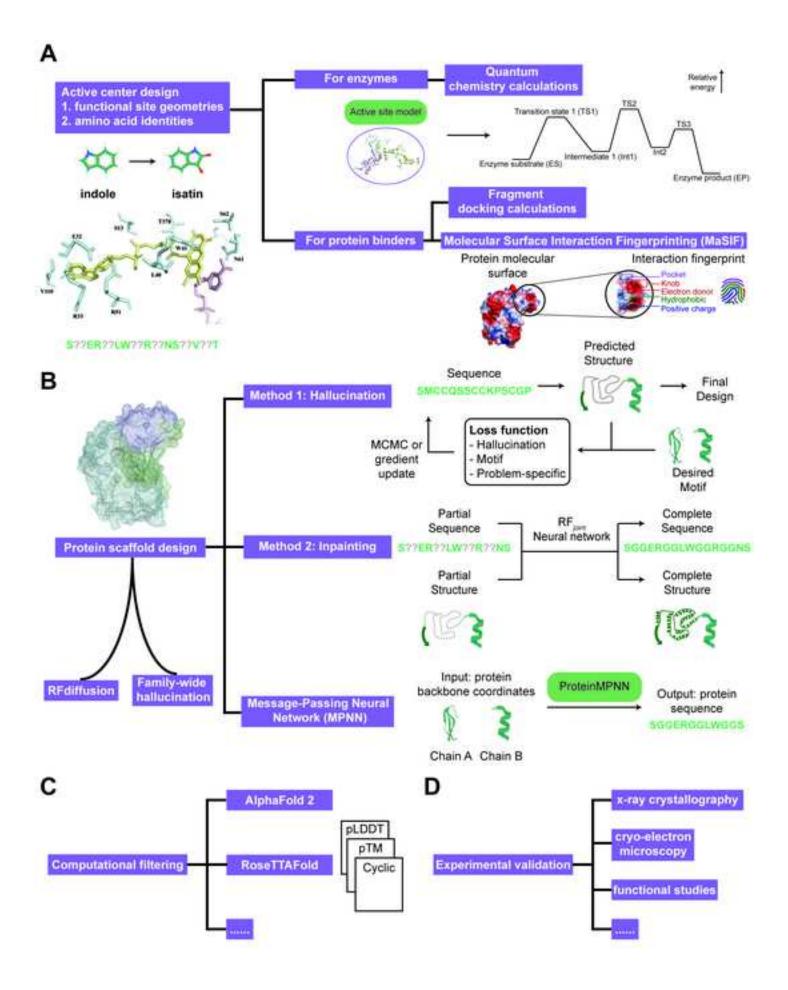


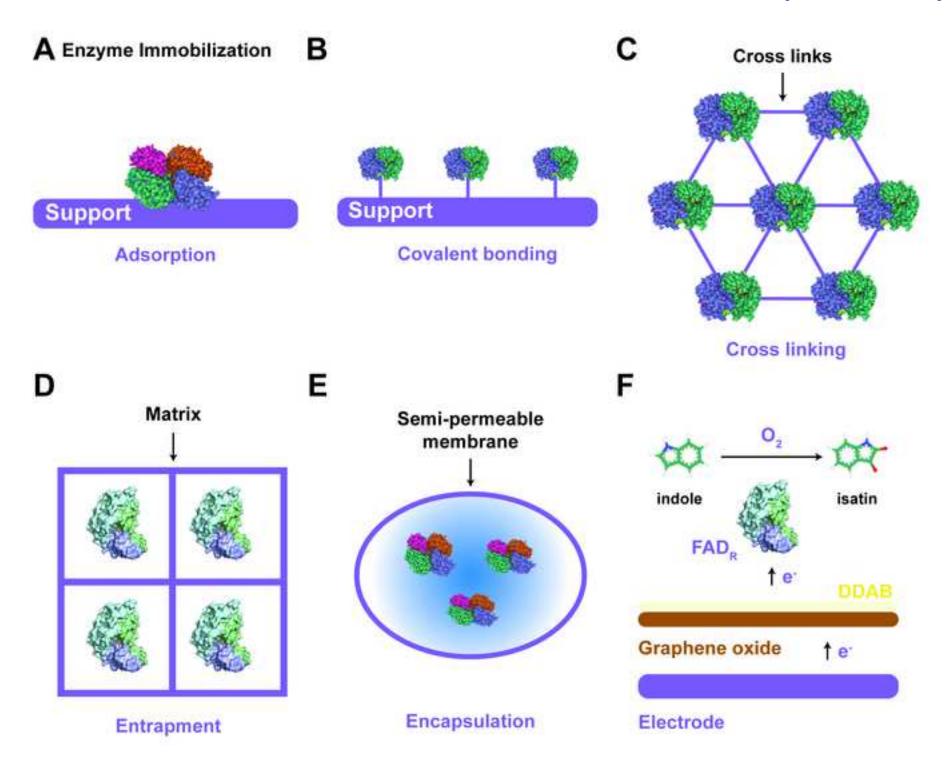


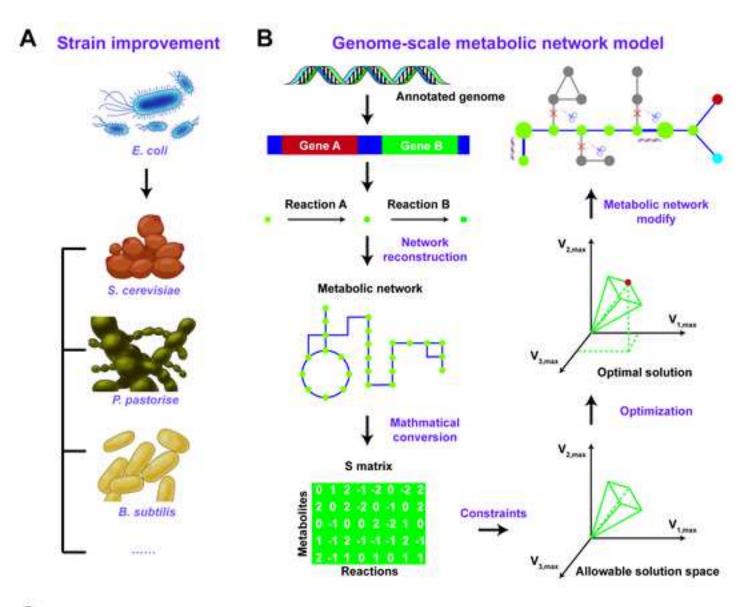




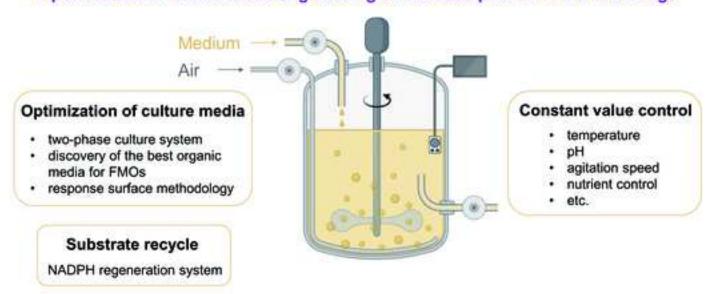








## Optimization in fermentation engineering to increase production of bio-indigo



Data Statement

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