1	Biosynthesis of Therapeutic Natural Products using Synthetic Biology
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8 Abstract

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10 Natural products are a group of bioactive structurally diverse chemicals produced by 11 microorganisms and plants. These molecules and their derivatives have contributed to over a third 12 of the therapeutic drugs produced in the last century. However over the last few decades 13 traditional drug discovery pipelines from natural products have become far less productive and far 14 more expensive. One recent development with promise to combat this trend is the application of 15 synthetic biology to therapeutic natural product biosynthesis. Synthetic biology is a young 16 discipline with roots in systems biology, genetic engineering and metabolic engineering. In this 17 review we discuss the use of synthetic biology to engineer improved yields of existing therapeutic 18 natural products. We further describe the use of synthetic biology to combine and express natural 19 product biosynthetic genes in unprecedented ways, and how this holds promise for opening up 20 completely new avenues for drug discovery and production.

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57 **1. Introduction**

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59 1.1 Natural Products as Therapeutics

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61 Chemicals found in nature have been used for therapeutic purposes since ancient times. The 62 ancient Egyptians and Greeks used salicylic acid from the bark of the willow tree to treat aches 63 and pains [1]. In the 19th century chemists at Bayer modified this substance to make aspirin. 64 Natural products like salicylic acid are small molecules produced by plants, bacteria and fungi that 65 have been selected by evolution for stability and interaction with biological polymers (proteins, 66 nucleic acids, carbohydrates and lipid membranes) [2]. Their importance to human health is 67 underscored by the fact that natural products and their derivatives comprise over 40% of drugs, 68 including antibiotics and anti-tumour and cholesterol-lowering agents [3, 4]. The major classes of 69 therapeutic natural product, along with an illustrative member of the class and the organism it was 70 discovered in is given in figure 1.

71 One class of therapeutic drug in particular, the antibiotics, has relied heavily on natural 72 products. The discovery of penicillin in 1928 heralded the "Golden Era" of natural products as 73 antibiotics [5]. In the decades since the 1980s, however, fewer and fewer new antibiotics were 74 being discovered in nature [6]. This situation led to a prioritising of pharmaceutical drug discovery 75 towards completely synthetic chemical avenues [7]. However, several recent trends have 76 motivated a move back to exploiting natural products [2]. This review focuses on one of these 77 developments: the application of synthetic biology towards the production of natural product-78 derived therapeutic drugs.

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80 1.2 Synthetic Biology for Therapeutic Production

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Synthetic biology has several definitions. Here we adhere to the definition that the goal of synthetic biology is to extend or modify the behaviour of organisms using molecular biology to perform new tasks in a predictable manner [8]. The relevant task in this case is the production of therapeutic natural products at commercially viable yields by a suitable host organism.

Natural products are mostly produced by the action of multiple genes [9]. In the simplest 86 87 scenario each gene encodes an enzyme that converts an input chemical into an output chemical 88 acted upon by the next enzyme until the final natural product is produced, in assembly-line fashion. 89 Together, these biosynthetic genes comprise a pathway. To produce natural products at high 90 yields, a synthetic biologist must balance pathway gene expression and host cell growth. This 91 endeavour must acknowledge the burden caused by the pathway gene expression, both via 92 siphoning away of host resources and via the build-up of toxic pathway intermediate products [10]. 93 In order to achieve this balance and maximise pathway yield, synthetic biology has developed 94 tools to allow finely-tuned control over pathway behaviour.

These tools fall into two main categories. The first category of tools has roots in the older disciplines of genetic engineering and metabolic engineering, and includes simple mutation and screening, rational modulation of host organism gene expression, protein engineering, directed evolution, and optimisation of growth conditions [11]. The second class of tools can be viewed as purely belonging to synthetic biology. These tools are based on adapting naturally occurring biological molecules at the DNA, RNA and protein levels to confer the desired behaviour to pathway function [12].

When it comes to optimising the production of natural products, the distinction between the terms "metabolic engineering" and "synthetic biology" is breaking down, as these terms are increasingly being used interchangeably in the literature [13, 14]. Thus this review discusses both categories of tools mentioned above, but specifically using cases concerning the production of natural products with therapeutic value.

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2. Known Natural Products

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110 In the majority of cases taken on by synthetic biology, the chemical structure of the natural product 111 is known. The main tasks faced by synthetic biologists in these cases are threefold. The genes 112 encoding enzymes that will convert starting chemicals into the final natural product must be 113 selected, and a host organism must be chosen. Finally, ways must be found to control the 114 expression of these genes to optimally balance pathway yield and host organism growth. These 115 tasks are not independent, for example, certain paradigms for gene expression control are specific 116 to prokaryotes or eukaryotes, and the cellular conditions of different hosts may favour different 117 types of enzymatic reaction, necessitating different pathway genes [11]. This process can be 118 illustrated by many recent examples and especially by the most celebrated case of a natural 119 product made using synthetic biology - that of the anti-malarial drug precursor, artemisinic acid 120 [10, 15].

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122 2.1 Choosing the Host Organism and Enzymatic Steps

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- 124 2.1.1 Natural Hosts
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The simplest cases involve optimising the production of molecules already made by an organism. A natural host is desirable when aspects of the cell biology and metabolism of the native host render them optimal for the production of certain compounds. Indeed, for perhaps the most prolific genus of natural product producers, the bacterial genus *Streptomyces*, this is precisely the case [2]. Certain biosynthetic enzymes responsible for the production of natural products in *Streptomyces* do not function well in common heterologous host organisms [16]. A similarly prolific natural producer, the fungal genus *Aspergillus*, is also considered a good host for biosynthesis ofnatural products that originate within its genus [17].

134 Species of both Streptomyces and Aspergillus produce a plethora of natural products, so 135 when the objective is to produce a single natural product at commercially viable levels, one 136 approach has been to delete or inactivate competing natural product pathways [18]. Further 137 advances have involved developing synthetic gene regulatory elements. One prominent example 138 is promoters, elements responsible for the strength of gene transcription. Synthetic promoters with 139 known strengths and promoters that are conditionally regulated have been developed to control 140 pathway expression in natural Streptomyces and Aspergillus hosts [19, 20]. This process of 141 creating a rationally optimised "natural" host strain allowed researchers to harness the natural 142 production capabilities of organisms that make native therapeutic natural products, to make 143 heterologous natural products. This endeavour can be viewed as an intermediate case between 144 using a completely natural host, and using a heterologous host as described below.

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146 2.1.2 Heterologous Hosts

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148 The metabolic cost of producing natural products is such that they are usually produced at levels 149 too low for commercial viability [11]. Thus the production needs to be optimised by a combination 150 of genetic manipulation and optimisation of growth conditions. However in most cases, natural 151 products are usually only found in organisms that are either not amenable to optimisation by 152 genetic means or are unsuitable for growth in the large-scale industrial vessels required for high 153 titres [21]. In other cases the desired pathway uses genes from many different organisms, so by 154 definition there can be no completely natural host [22]. In these scenarios using a heterologous 155 host provides a solution.

For industrial production of natural products, the most widely used heterologous host organisms are the bacterium *Escherichia coli* and the yeast *Saccharomyces cerevisiae*. The reasons include their ease of genetic manipulation, their extremely well-understood cell biology, the availability of extensive metabolic models, and their ability to tolerate industrial growth conditions. Other important heterologous hosts include the yeast *Pichia pastoris*, which can be grown on cheap carbon sources, and the fungus *Aspergillus oryzae*, which has cell biology suitable for the production of polyketides and nonribosomal peptides [23].

An important consideration for the choice of host is whether there is pathway-specific biology that cannot be achieved by every host, although these issues can sometimes be solved by genetic engineering. For example, some natural products require certain enzymatic reactions to occur in sub-cellular organelles. For instance, the final reactions in penicillin biosynthesis occur naturally in peroxisomes [24]. Recent work to produce penicillin in a heterologous host used the yeast *Hansenula polymorpha* due to its extremely large peroxisomes [25, 26]. Another salient example concerns the expression of cytochrome p450 genes. These genes are extensively 170 involved in the biosynthesis of therapeutic natural products such as artemisinic acid, but their 171 expression in E. coli, has been problematic [27]. Cytochromes p450 are not naturally found in E. 172 coli, and that organism lacks some of the cellular machinery for their proper expression [28]. By 173 contrast, yeasts such as S. cerevisiae and P. pastoris have naturally occurring cytochrome p450s 174 and might represent better hosts for certain cytochrome p450 containing pathways [29]. For 175 example, a recent study simultaneously expressed multiple cytochromes p450 in S. cerevisiae to 176 make ginsenosides, potentially therapeutic natural products that are the primary bioactive 177 compounds of ginseng [30].

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179 2.1.3 Multiple Hosts

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Sometimes no single organism can adequately carry out the entire biosynthetic pathway for a given natural product. However, pathways can sometimes be split up between different host organisms. In a recent study from Zhou and co-workers, the plant natural product paclitaxel, an anti-tumour drug, was produced by splitting the biosynthetic pathway between the model heterologous hosts *E. coli* and *S. cerevisiae* [31].

186 The paclitaxel pathway can be conceptualised as a preliminary stage producing the 187 precursor taxadiene, and a second stage chemically functionalising the taxadiene via oxygenation 188 reactions. Production of the precursor taxadiene at high yields was hypothesised to be more 189 efficiently carried out by E. coli due to its faster growth dynamics relative to S. cerevisiae. Due to 190 its cellular biology and the presence of abundant cellular membranes, S. cerevisiae was 191 hypothesised as a good host for the second part of the pathway, mediating the oxygenation 192 reactions. Indeed, when these two microorganisms were engineered to harbour the genes 193 encoding the respective parts of the pathway and then co-cultured, the resulting consortium 194 produced 33 mg/L of paclitaxel. A key point was that the authors used the different biology of the 195 two host organisms to ensure co-operation to make the natural product. Namely, S. cerevisiae was 196 unable to use xylose in the media as a carbon source, but could use the acetate produced by E. 197 coli, as shown in Figure 2b. When they tried a similar strategy using two different engineered 198 strains of *E. coli*, the yield was much lower.

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2.1.4 Choosing Enzymatic Steps for the Pathway

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For a given natural product there is often more than one particular biosynthetic route of enzymatic steps that take inputs to make the final product [23]. Depending on the host organism chosen, more or less of the pathway can be carried out by native genes in the host without relying on heterologous genes. This concept can be illustrated by the biosynthesis of artemisinic acid, precursor to the anti-malarial drug artemisinin. The first part of the pathway requires the production of the precursor farnesyl pyrophosphate (FPP). This precursor is produced natively by the primary 208 metabolism of both S. cerevisiae and E. coli. In the original work to produce artemisinic acid, 209 Keasling and co-workers used S. cerevisiae yeast as a host organism, and were able to recruit the 210 S. cerevisiae mevalonate pathway to produce the required FPP [15]. Concurrent work to produce 211 artemisinic acid in *E. coli* could have utilised the native *E. coli* deoxyxyulos-5-phosphate pathway 212 to produce FPP, but instead chose to import the mevalonate pathway from S. cerevisiae [10]. 213 These cases illustrate both how there is often a choice of which enzymatic steps to take from 214 metabolic inputs to natural product, and how that choice can depend on the particular host 215 organism.

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217 2.2 Optimising Pathway Yield

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219 After initial expression of the pathway genes in the chosen host and successful production of the 220 desired product, the next set of tasks involve increasing the yield to commercially viable levels. 221 Simply over-expressing every pathway gene is usually insufficient, as there is a burden on the host 222 caused by heterologous gene expression, and stresses also arise from any protein mis-folding and 223 aggregation [32]. Foreign enzymes usually also cause further 'metabolic burden' by siphoning 224 away key metabolites and co-factors from host primary metabolism, consuming energy during their 225 reactions (e.g. via ATP use) and by altering the redox state of the cell. Furthermore, many 226 enzymes within a pathway will also produce intermediates that are toxic to the host organism [33, 227 34]. Therefore, rather than over-expressing each enzyme in the pathway, expressing just enough 228 to allow for efficient catalytic turnover between metabolic inputs and intermediates is often a better 229 approach [10]. The most important approaches developed by synthetic biology to achieve balance 230 between pathway yield and host health are discussed below.

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232 2.2.1 Rational Approaches

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Rational approaches involve making specific, calculated changes to the production system that are predicted to allow more throughput, or "flux", through the pathway from while not increasing burden on the host. These changes are predicted based on metabolic modelling methods that rely on measuring metabolic flux through the pathway. These measurements typically come from experimental techniques such as LCMS, GCMS and proteomics, combined with computational methods that take into account genome-scale metabolic models. For more detail the reader is directed to several excellent reviews covering these methods [35-38].

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242 2.2.1.1 Increasing Precursor Supply and Inactivating Competing Pathways

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244 One conceptually straightforward means of increasing the yield of a natural product pathway is to 245 genetically modify the host organism to bias its primary metabolism to produce more of a pathway 246 substrate, as illustrated in Figure 2 [11]. The early work on artemisinic acid did exactly this, by 247 increasing the expression levels of modified versions of the S. cerevisiae mevalonate genes 248 HGMR and ERG20 [15]. These are both host genes responsible for the production of FPP, a 249 precursor to artemisinic acid. Over-expression was achieved by integrating additional copies of 250 both genes into the host genome. Aside from up-regulating the expression of genes whose activity 251 directly increases the amounts of a precursor, another strategy shown in Figure 2 is to inactivate 252 host metabolic pathways that siphon away the precursor for competing products [11]. In the case 253 of artemisinin production, the S. cerevisiae ERG9 gene was down-regulated by placing it under the 254 control of a methionine-repressible promoter. ERG9 deletion was not an option, since it is a gene 255 essential for growth of the host organism. However, inducible down-regulation was able to decrease the amount of the artemisinin precursor FPP being consumed in the host's competing 256 257 sterol biosynthesis pathway.

258 More recently, pioneering work from several different labs has made feasible the production 259 of the medically important benzylisoquinoline alkaloids (BIAs) class of natural products so that 260 these can be made from simple sugars by S. cerevisiae yeast [39]. Prominent examples of BIAs 261 include reticuline, morphine and codeine. In one of the key studies enabling this production, 262 Trenchard and co-workers increased the supply of the BIA precursor tyrosine to achieve a 263 increased production of norcoclaurine, a BIA scaffold molecule [40]. Highlighting the power of 264 using a well-studied host organism, this was done by identifying six genetic modifications in S. 265 cerevisiae yeast that genome-scale metabolic models predicted by genome-scale metabolic 266 modelling to increase the supply of intracellular tyrosine. Three of the six postulated changes 267 proved to be effective, and combined gave a 60-fold increase in the levels of the norcoclaurine 268 produced.

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270 2.2.1.2 Spatial Strategies

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An important concept in optimising yields of a heterologous pathway is the efficient channelling of metabolic intermediates. Channelling entails quickly co-ordinating the products of one enzyme in a pathway to serve as a substrate the next enzyme in the pathway. This gives two advantages for balancing product yield and host organism health. First, there is less time for competing pathways to consume any intermediates if they are processed quickly through the pathway. Second, this prevents the build-up of toxic pathway intermediates within the cell.

The obvious strategy, and one harnessed by nature in some native metabolic pathways [34], is spatial organisation of the pathway enzymes in a way that encourages the efficient channelling of intermediates. One synthetic biology mechanism to achieve this is scaffolding, where pathway enzymes are tethered to a synthetic physical scaffold in a manner that places active sites in coordination 283 The earliest demonstration of scaffolding in natural product biosynthesis was achieved by 284 Dueber et al who built several versions of a synthetic protein scaffold system by interspersing a 285 varying number of the protein binding domains GBD, SH3 and PDZ with linker regions consisting 286 of non-structure forming amino acids [41]. They then attached the cognate partners of each of 287 these domains to the C-terminals of the three enzymes that produce mevalonate (a precursor to 288 the artemisinin precursor, FPP), AtoB, HMGS and HMGR respectively, as shown in Figure 2b. 289 These tagged enzymes now bound to the synthetic protein scaffolds and the best combination of 290 one AtoB, two HMGSs and two HMGRs enzymes aligned on a scaffold gave a 77-fold 291 improvement in yield over simple expression of the free enzymes. A useful aspect of scaffolding is 292 that the relative stoichiometry of pathway enzymes can easily be titrated. Aside from protein 293 scaffolds, RNA and DNA-based scaffolds have also been used to increase pathway yield in other 294 studies [42, 43].

295 The second spatial strategy is compartmentalisation of pathway enzymes, shown in Figure 296 2b. In nature, eukaryotic cells confine certain biochemical pathways to various organelles and 297 prokaryotic cells to various proteinacious compartments [44]. Compartmentalisation not only 298 increases local enzyme concentration and prevents build-up of toxic intermediates but further 299 protects the host organism from any toxic metabolites, and can provide specialised conditions for 300 enzymatic reactions, such as a different pH or altered salt or input metabolite concentrations [45, 301 46]. Therapeutic natural product pathways that use compartmentalisation include the production of 302 the antibiotic bacillaene in a membrane-bound subcellular compartment of B. subtilis [47], and the 303 occurrence of the last two steps of penicillin biosynthesis in the peroxisomes of filamentous fungi 304 [34]. Compartmentalisation has also been used as a strategy for the manufacture of a natural 305 product in a heterologous host. An important early example concerns the production of plant 306 terpenoids in S. cerevisiae. The engineering of plant sesquiterpene production into heterologous 307 hosts has already been discussed with regard to the therapeutic natural products artemisinin and 308 paclitaxel. In this study the production of a precursor to artemisinin - amorphadiene - was 309 optimised by compartmentalisation. Specifically, researchers targeted the final two enzymes of the 310 amorphadiene biosynthesis pathway to the mitochondria of S. cerevisiae. In doing so they 311 achieved an increase in amorphadiene yield of 20-fold over a version of the pathway in which 312 these enzymes were not compartmentalised [48].

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314 2.2.1.3 Dynamic Control

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The above approaches all involve changing gene expression or enzyme localisation in static ways. However, one area where synthetic biology has made great progress is in engineering organisms to perform logical operations [49]. This involves building systems able to produce different outputs given different inputs. An important example of how this aids natural product manufacturing is via inducible gene expression. Ever since mathematical logic was first discovered to apply to gene regulation [50] biology has utilised promoters that can induce or repress gene expression based on the presence or absence of small molecules such as arabinose and tetracycline. Efforts in synthetic biology have vastly expanded the number of available promoters responsive to such molecules [51, 52].

325 Inducible promoters have been important for biosynthesis as they allow production by a 326 pathway to be switched on when desired. This is usually only after the host organism has reached 327 exponential growth phase, allowing host resources to be used for growth initially, and then diverted 328 to biosynthesis when enough host cells are present and a stable maintenance phase is reached 329 [23, 53]. The construction of synthetic promoters induced by a variety of molecules is an important 330 endeavour that enables improved metabolic engineering and it has now been extended to a variety 331 of host organisms. In the important natural producer genus Streptomyces, several promoters have 332 been constructed that are inducible by small molecules such as thiostrepton [54], gamma-333 butyrolactones [55] and tetracycline [56]. There are also now tetracycline-inducible promoters 334 available for work in cyanobacteria [57]. In more established hosts, important new inducible 335 promoters have also been made. Aromatic amino acid-inducible promoters constructed for use S. 336 cerevisiae [58] now enable expression of pathway enzymes to be responsive to molecules that 337 are themselves precursors or intermediates in natural product pathways.

338 In order to extend the paradigm of inducible or repressible gene expression, synthetic 339 biology has also exploited RNA elements such as riboswitches. These are RNA regions whose 340 three dimensional conformation allows it to bind to a small molecule and then change shape in a 341 manner that influence the surrounding RNA. Natural riboswitches are usually found in the non-342 coding regions of messenger RNAs (i.e. the 5'UTR, introns, 3'UTR), and binding of small 343 molecules by riboswitches influence the expression from mRNA either positively and negatively via 344 regulation of transcription, translation or mRNA processing [59]. The part of the riboswitch that 345 binds the small molecule is called the "aptamer domain", and the part mediating changes in gene 346 expression is called the "expression domain". Synthetic biology has recently discovered rules for 347 the engineering of both domains [60], so that riboswitches can now to some extent be rationally 348 designed using computational approaches [61]. One promising recent example by Amin and co-349 workers uses physics-based modelling of RNA-folding to better design riboswitches that affect 350 translation in response to various ligands [62]. This approach achieved some success in designing 351 riboswitches that displayed improved modularity, an important attribute for synthetic biology 352 applications.

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354 2.2.2 Semi-rational approaches

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The approaches to pathway expression control discussed so far all seek to apply specific, predetermined changes to the system, usually informed by measurement and modelling studies. These changes are informed by the use of experimental approaches such as LCMS and 359 proteomics in conjunction with genome-scale metabolic models and computational algorithms. 360 There is another class of tools useful when it is not known what changes will bring about the 361 desired pathway behaviour. These tools instead seek to explore various solution spaces in a more 362 or less targeted fashion. Another important aspect of optimising pathway yield in a semi-rational 363 manner concerns optimising growth media for the producer organism(s). For example, 364 consideration must be given to the temperature and pH chosen for production. Often these 365 parameters are explored in a statistical manner that efficiently explores the media composition 366 space, such as "design of experiments" [63].

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368 2.2.2.1 Exploring Pathway Gene Expression

369 370 In natural product pathways and indeed biosynthetic pathways in general, the levels of each of the 371 pathway enzymes relative to one another have been honed by evolution for an optimum balance 372 between pathway expression and host fitness [11]. When natural product pathways are 373 engineered into new hosts, it is most often not clear a priori what the optimum relative expression 374 levels for natural product pathway genes are. As such, it is useful to explore the 'expression space' 375 by testing different levels of expression for each pathway gene. An area in which synthetic biology 376 has devoted much effort has been the development of part libraries for expression control. In 377 engineering parlance, a part is a standalone object whose properties with regard to the systems in 378 which it will be used are well understood in any context. In practical terms this ideal is much more 379 a reality in other engineering disciplines than in synthetic biology where much is still unpredictable 380 about how parts will behave in different contexts [64]. Nonetheless, great strides have been made 381 to develop libraries of gene regulatory parts for different hosts, such as promoters and transcription 382 terminators (for eukaryotic and prokaryotic hosts) and ribosome binding site (RBS) sequences (for 383 prokaryotic hosts). 384 Synthetic biology kits have been developed to use these part libraries in conjunction with

385 recently developed combinatorial DNA cloning techniques [65, 66] to allow the rapid assembly of 386 genes and pathways in a modular fashion. These kits typically contain libraries of parts that direct 387 different strengths of enzyme expression, and are particularly of use for the standard hosts E. coli 388 [67] and S. cerevisiae [68]. To illustrate the value of modularity in building a pathway, we can 389 consider a hypothetical natural product pathway with three genes to be expressed in *E. coli*. Using 390 a DNA assembly kit with part libraries we can assemble the protein coding regions of the three 391 genes with each type of regulatory part (promoter, ribosome binding site and terminator). If the kit 392 contains three versions of each of these parts, each directing different strengths of enzyme 393 expression, then this gives over 200 different combinations that could be built to make the pathway 394 and each of these will yield different levels of the three enzymes within the cell. With modern DNA 395 assembly methods, all of these possibilities can be constructed in one go in a 'one-pot reaction'. 396 When different combinations of regulatory parts are tried out to explore the expression space it is called a 'combinatorial approach', and this has been used recently to optimise production of the
 therapeutic natural product violacein in *S. cerevisiae* [69].

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400 2.2.2.2 Protein Engineering and Directed Evolution

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402 Changing the expression levels or the spatial organisation of pathway enzymes can improve 403 biosynthesis yields, but changing the amino acid sequences of the enzymes can make even more 404 dramatic improvements in yield. For example by increasing the specificity of an enzyme for its 405 intended substrate, unwanted catalysis of wasteful side reactions can be reduced, improving 406 biosynthesis yields. Enzyme improvements like this can be achieved by mutagenesis of the coding sequence of the enzyme-encoding gene, however, it is often difficult to do this in a completely 407 408 rational way, largely because that requires detailed understanding of the enzyme 3D structure. The 409 number of solved protein structures for enzymes is relatively low compared to known protein 410 sequences [70], and even when structures are known, catalytic site prediction is not trivial [71]. 411 This makes it difficult to identify the important amino acid residues that could be mutated.

412 Instead if a simple test exists for enzyme activity, then enzymes can be more easily 413 optimised by screening many designed or random gene variants that lead to a different mutations 414 within the enzyme. When this process of mutagenesis and screening is repeated several times, 415 with the best variants from one round selected as starting points for the next round, this is known 416 as directed evolution [72]. In the recent case of production of precursors for the benzylisoquinoline 417 alkaloids (BIAs), an elegant screen was used to optimise one of the pathway enzymes for 418 dopamine production in the host organism S. cerevisiae. A promiscuous pathway enzyme that 419 catalysed the desired conversion of L-tyrosine to L-DOPA, also catalysed an undesired reaction 420 siphoning L-DOPA away to L-Dopaguinone. To address this problem, DeLoache and co-workers 421 developed a biosensor-based screen utilising another enzyme (DOD) that convert L-DOPA into the 422 yellow fluorescent pigment, betaxanthin [73]. By mutating their pathway enzyme in the presence 423 of the DOD enzyme, they could screen for improved L-DOPA production by looking for increased 424 vellow pigment accumulation. A mutant library over 200,000 variants of the pathway enzyme 425 generated by error-prone PCR was screened and the best mutants selected for another round of 426 mutagenesis and screening. This resulted in the identification of two amino acid mutations that 427 together resulted in a 4.3-fold increase pigment production. The final mutated enzyme (a tyrosine 428 hydroxylase) was shown to increase the amounts of intracellular L-DOPA available for Dopamine 429 biosynthesis 2.8-fold versus the original enzyme, thanks to mutations that lowered the activity of 430 the detrimental side reaction.

In synthetic biology terms, something that detects the presence of a molecule and is able to produce an easily-detectable output in response is called a biosensor [74]. For DeLoache and coworkers, their biosensor (an enzyme in this case) already existed in nature and formed the basis of their screen. However, often a convenient biosensor is not readily available for the purposes of 435 directed evolution of a natural product pathway. To address this synthetic biologists can develop 436 novel biosensors or identify proteins or nucleic acids from other organisms that can be repurposed 437 to work in biosensors. Many proteins detect metabolites and these natural roles can be exploited. 438 For example, E. coli has over 200 transcription factors and many of these can sense different 439 metabolites. Sometimes these can be engineered to detect a desired metabolite too [75]. RNA-440 based biosensors are also a useful tool. A recent study used an RNA-based sensor called a 441 ribozyme (RNA that self-cleaves when it binds to its ligand) in order to screen for better producers 442 of N-acetyl glucosamine, a small molecule with therapeutic properties [76]. In this study the 443 ribozyme detects levels of intracellular glucosamine 6-phosphate (GlcN6P), a precursor to N-acetyl 444 glucosamine (GlcNAC). Placing this ribozyme in the 3' untranslated region of an essential gene in 445 the host organism, S. cerevisiae, means that self-cleavage leads to cell death. This setup was 446 used to screen a mutant library of variants of an enzyme called GFA1, which converts GlcN6P to 447 GlcNAC. Any enzyme variants that did not efficiently convert GlcN6P to GlcNAC would leave high 448 levels of GlcN6P free to bind to the ribozyme and trigger cleavage of the essential gene's mRNA. 449 Coupling mutation with this screen resulted in selecting a variant of GFA1 five times more efficient 450 than its original version.

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452 2.2.2.3 Genome Engineering

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454 A complementary approach to optimising the output from a natural product pathway is to 455 optimise the host itself. The least rational way of doing this is to use random mutagenesis coupled 456 with screening for the desired property. This approach was used to optimise fungal strains for the 457 manufacture of one of the first commercially produced natural products - penicillin [11]. This 458 forward mutagenesis is completely random in terms of what genes will be mutated in the host 459 genome and contrasts to targeted mutagenesis described in the sections above, where a single 460 gene or region with this is altered. More recently, synthetic biology methods have been developed 461 that allow much more directed genome mutagenesis. One of these methods, popular in *E. coli*, is 462 called multiplexed automated genome engineering (MAGE) [77] and relies on hijacking the cell's 463 DNA replication machinery. Large number of short pieces of single-stranded DNA (oligos) with a 464 few mismatches to the genome sequence are added to the cell and allowed to incorporate into 465 daughter chromosomes during DNA replication. The sequences of these oligos determine where 466 they make base pair changes in the genome, and allow for simultaneous mutagenesis of multiple 467 loci. By varying the number of oligos and their base sequences, researchers can mutate both the 468 number of genomic sites to be mutated and the degree of saturation of mutation. Combined with 469 genome-scale metabolic models [78, 79] and computational tools to predict which host genomic 470 changes will be most effective for aiding greater production of a heterologous genetic pathway 471 [80-82], genome-scale engineering using MAGE can be a very powerful tool. Recently this 472 approach was used to effectively increase the production of resveratrol, a natural product of therapeutic value, by making genome-wide mutations predicted to increase production of thepathway precursor malonyl-CoA [83].

475 Similar to MAGE, the more recently developed CRISPR-Cas9 technology for directed and 476 multiplex chromosome cutting also allows multiple simultaneous genetic changes to be made to 477 genomes [84, 85]. Unlike MAGE, the CRISPR-Cas9 system is universal to many organisms 478 amenable to genetic transformation, opening up the use of genome engineering to optimise many 479 hosts for natural product pathways. Typically, the CRIPSR-Cas9 system consists of two 480 components: a protein and an RNA. The protein component is the Cas9 endonuclease that cuts 481 DNA. The RNA component, termed the guide RNA, directs Cas9 to a genomic locus by Watson-482 Crick base pairing. This latter feature makes the system far easier to target to particular genomic 483 loci than previous genome editing endonuclease technologies such as TAL-effectors and zinc 484 finger nucleases [86].

485 The Cas9 system can also be modified to not cut DNA (CRISPR-dCas9). When fused to 486 transcriptional activator or repressor protein domains, dCas9 can target genomic promoters to 487 activate or repress gene expression. This potentially enables multiplex and targeted alteration of 488 host gene expression, which could be used to optimise the host for pathway output. Indeed, this 489 approach has recently been applied to demonstrate fine control over pathway intermediates in the 490 production of the therapeutic natural product violacein [87]. In this important work Zalatan and co-491 workers altered the paradigm above to make it easier to engineer. Instead of fusing transcriptional 492 activator or repressor domains to the dCas9 protein, transcriptional modulating capabilities were 493 engineered into the guide RNA component of the CRISPR-dCas9 system. This was achieved by 494 extending the guide RNAs with scaffold RNAs that acted as docking sites for RNA-binding protein-495 transcriptional modulator protein fusions. Using these augmented guide RNAs and fusion proteins 496 in concert with dCas9 expressed under a galactose-inducible promoter, Zalatan and colleagues 497 were able to easily induce entire transcriptional programs in engineered S. cerevisiae cells. In this 498 manner, complete control was achieved over the violacein biosynthetic pathway in the 499 heterologous host, with high production of each of the possible pathway intermediates depending 500 on which combination of augmented guide RNAs was expressed.

501 The field of genome editing with CRISPR is rapidly evolving, and new developments include the 502 use of alternate endonucleases such as Cpf1, that allow greater convenience and specificity in 503 certain cases [88]. For more in-depth discussion of CRISPR in a metabolic engineering context, 504 the reader is pointed to the following recent review [89].

505

506 3. Unknown and Unnatural Natural Products

507

508 The examples discussed above use synthetic biology to improve the production of therapeutic 509 natural products with known biosynthetic pathways. The following sections address cases where 510 synthetic biology is used to discover new (unknown products) therapeutic natural products in 511 nature, or to create therapeutic molecules not found in nature (unnatural products).

512

513 3.1 Unknown Natural Products

514

515 The biosynthetic genes that encode each of the major classes of natural products illustrated in 516 Figure 1 often have signature features that are common to most members of the class. 517 Biosynthesis of the terpenoids, alkaloids, nonribosomal peptides and polyketides involves the 518 production of a chemical scaffold molecule, which is often decorated by the addition of functional 519 groups, or by cyclisation and branching to create a plethora of possible molecules [90-92]. Each of 520 these four major classes of natural product has signature biosynthetic genes encoding enzymes 521 specific to that class, and often these genes physically cluster together in genomes, as illustrated 522 in Figure 3a [93, 94].

523 These two features allow the computational prediction of natural product biosynthesis 524 genes in sequenced genomes. Indeed, probabilistic computational tools and standards have been 525 developed to automate this prediction in genome sequences, even when the genome is otherwise 526 unannotated [95, 96]. Given that most of our therapeutic drugs are derived from natural products, 527 the discovery of novel natural products is a promising avenue for the development of novel 528 therapeutic drugs. The situation where natural product genes can be predicted means that 529 currently "unknown natural products" can be inferred, and their chemical structure predicted before 530 the molecule is ever detected.

- 531
- 532

533 3.1.1 Genomics

534

With the advent of the genomic era and abundant cheap DNA sequencing, it was realised that the genomes of some of the most prolific producers of therapeutic natural products, such as the *Streptomyces* bacteria and *Aspergillus* fungi, contained many more biosynthetic gene clusters than the number of natural products known to be made by these species [97]. One explanation for this discrepancy is that in the native organism natural products are often associated with specific developmental stages or environmental conditions, and that these stages or conditions are not elicited under laboratory growth conditions [98].

542 To this end, synthetic biology strategies have been applied to 'awaken' these silent natural 543 product gene clusters. These strategies have relied on adding or removing genetic control 544 elements (e.g. promoters) to the cluster, in an effort to bypass any native regulation that keeps the 545 cluster silent. Figure 3b depicts this process, which is known as 'refactoring' the cluster [9]. 546 Refactoring can be done within the native natural product host organism if it is amenable to genetic 547 manipulation, or by cloning the entire cluster, with modifications, to a heterologous host. One type 548 of target for refactoring is cluster-specific genes that regulate transcription of the natural product 549 genes. For transcriptional repressors, the idea is to delete these genes, and the opposite is true for 550 transcriptional activators. A recent example demonstrating the utility of this approach concerned a 551 nonribosomal peptide gene cluster found in a marine bacterium, the actinomycete 552 Saccharomonospora sp. CNQ490. Computational analysis of the draft genome of this organism 553 identified 19 putative natural product gene clusters, most of which were silent clusters, and only 554 one of which only one had an associated known product. Upon identifying a silent cluster predicted 555 to produce a nonribosomal peptide. Yamanaka and co-workers set out to refactor the cluster by 556 removing a negative regulatory gene [99]. Using a "transformation and recombination cloning" 557 (TAR cloning), the authors deleted a cluster gene predicted to encode a repressive transcription 558 factor. The resulting mutant cluster (but not the wild type cluster) produced a series of novel 559 chlorinated lipopeptides similar to the known antibiotic daptomycin.

A related approach involves modifying the promoters of cluster-specific biosynthetic genes, rather than transcription factors residing within clusters. This approach was recently used in a study that added arabinose-inducible promoters to allow the cluster to be switched on as desired. This refactoring enabled activation of a silent gene cluster from the symbiotic bacterium *Xenorhabdus budapestensis* that produced a compound similar to the antibiotic holomycin in the [100]. Examples of this type demonstrate the utility of awakening silent clusters towards discovering novel therapeutic molecules.

567 Another trend in the genomics of 'unknown' therapeutic natural products has been to 568 sequence the genomes and transcriptomes of plants used in traditional medicine. The motivation 569 in these cases is that these organisms are more likely to be enriched for novel therapeutic natural 570 products. While there are several recent studies using this approach to identify candidate 571 biosynthetic genes for therapeutic alkaloids and terpenoids [92, 101, 102], synthetic biology 572 approaches to produce these compounds have lagged behind. One potential reason for this 573 situation is the apparent observation that plant therapeutic natural product genes are not as often 574 physically clustered in the genome as their counterparts in bacteria and fungi [103], making their 575 computational identification more difficult.

576

577 3.1.2 Metagenomics

578

In addition to sequencing the genomes of individual organisms, the falling costs of DNA sequencing and improving computational methods mean that whole communities of microorganisms in environmental soil, in the human gut and in ocean samples can now be sequenced as one [9, 93]. Analogously to the situation for individual genomes, silent natural product pathways can be identified from these metagenomes. In this case it is unclear that these pathways are silent in their hosts since it is not clear what each organism is within such a mixed environmental sample: typically these are organisms that have never been grown in lab conditions. These clusters are appropriately called 'cryptic' clusters and refactoring approaches have successfully enabled expression of these pathways in heterologous hosts. For example, Brady and co-workers mined metagenomes of diverse microbial communities associated with extreme conditions (i.e. drought, high temperatures and salinity) and found and heterologously expressed novel polyketide and nonribosomal peptide gene clusters and successfully produced new antibiotic, and anti-tumour agents and an immunosuppressant [104, 105]. As more metagenomes become available, this approach will likely become increasingly important.

593

594 3.2. Unnatural Products

595

A long-term goal of natural product research has been to create new 'unnatural' variants of natural products by understanding and manipulating the biosynthetic logic behind certain classes of natural product. It has been reasoned that tweaking the biosynthetic enzymatic machinery appropriately would create novelty while retaining the chemical properties that make natural products valuable as therapeutic drugs.

601

602 3.2.1 Incorporating Unnatural Precursors

603

604 The biosynthesis of natural product genes of all four of the main classes shown in Figure 1 begins 605 with incorporation of simple chemical building blocks, or monomers into a larger chemical 606 backbone. One strategy for generating unnatural natural products has been to feed the host 607 organisms with unnatural, synthetic variants of the natural building blocks, or precursors, as can be 608 seen in Figure 4a. This approach relies on the ability of the natural product biosynthetic enzymes 609 to tolerate non-cognate substrates. This approach was recently used to explore the substrate 610 promiscuity of a polyketide biosynthetic enzyme that normally produces rhizoxin, a potent 611 antimitotic agent [106]. By expressing the polyketide biosynthetic gene in a heterologous host and 612 feeding different synthetic monomers, they were able to change the final 'unnatural product' into 613 molecules that more closely resembled the antibiotic cyclohexamide. Similarly, pioneering work from the O' Connor group has extended this paradigm to alkaloid natural products. The 614 615 Madagascar periwinkle (C. roseus) is a medicinal plant that produces over 100 different alkaloids, 616 including the anti-cancer agents vincristine and vinblastine [92]. By feeding this plant synthetic, 617 derivatised versions of tryptamine, the natural building block for terpene indole alkaloids (TIAs), 618 McCoy and co-workers were able to generate potentially bioactive unnatural TIAs [107].

This approach can also be used for developing completely new drugs. Asai and co-workers recently discovered a novel polyketide biosynthetic gene in the fungus *Chaetomium*, and expressed this pathway in the heterologous host *A. oryzae*. This pathway was found to produce several polyketides via the production of a very reactive intermediate which was exploited by feeding the heterologous host a library of chemically synthesised molecules, resulting in a set of structurally diverse 'pseudo-natural products' [108]. Importantly, one of these products showed
potent activity against adenovirus, a highly infective virus family with few current treatments. This
demonstrates the utility of harnessing natural product biosynthetic machinery to produce new
molecules that potentially can become new drugs.

A complementary strategy has been to mutate natural product biosynthetic enzymes to increase their tolerance for non-cognate substrates. A single mutation in a nonribosomal peptide biosynthetic gene has been shown to relax its substrate specificity and allow incorporation of nonnatural amino acids functionalised with azide and alkyne groups [109]. These groups enable the final product molecules to be used in CLICK chemistry, which can be used to further diversify unnatural products to improve their therapeutic value by increasing bioactivity or reducing toxicity [110].

635

636 3.2.2 Combinatorial Biosynthesis

637

638 In the context of natural products, 'combinatorial biosynthesis' is the bringing together of enzymes 639 from different biosynthetic pathways to produce molecules not found in nature. An overview of this 640 approach is outlined in Figure 4c. Synthetic biology is particularly well suited to this task as it 641 involves either expression of enzymes in heterologous hosts or modification of enzymes in natural 642 hosts. One example concerns saponins, a type of terpenoid. Saponins are structurally diverse 643 bioactive compounds composed of 30-carbon scaffolds that are decorated with multiple functional 644 groups and sugars. One of the key functional groups is the hydroxyl group, added by a family of 645 enzymes called cytochromes p450. In a recent study, Moses and co-workers cloned a novel 646 cytochrome p450 from a plant used in Asian traditional medicine and used synthetic biology 647 approaches to express it along with the saponin scaffold biosynthetic enzymes and 648 glycosyltransferases in the heterologous host S. cerevisiae [111]. In this manner they were able to 649 generate unnatural, potentially bioactive saponins decorated with new combinations of hydroxyl 650 and sugar groups.

651 In natural product biosynthetic pathways in general, during and after the production of the 652 main chemical backbone molecule via the linking of monomers, further chemical diversity is often 653 achieved by the action of specialised tailoring enzymes [112]. These enzymes introduce small 654 chemical modifications, such as the addition of methyl, hydroxyl, sulfyl and glycosyl groups. By 655 expressing independent tailoring enzymes in conjunction with the main biosynthetic genes, 656 potentially unnatural diversification of the backbone molecules can be achieved. These 657 modifications are often important for conferring bioactivity or for removing toxicity to human cells 658 [113]. In a recent study by Yin and co-workers, a class of tailoring enzymes was discovered by 659 computational analysis of the draft genome of an Actinoplanes fungus. The authors used two of 660 these enzymes to add sulphate and glycosyl groups to a nonribosomal peptide antibiotic produced 661 by a different organism, the bacterium Streptomyces toyocaensis [114]. Another study expanded 662 this paradigm to include tailoring reactions not normally present in natural products. In this seminal 663 work, Walker and co-workers exploited enzymes in the only biological pathway known to utilise 664 fluorine to site-specifically incorporate fluorine into two polyketides in vivo [115]. In a similar vein, 665 Runguphan and co-workers expressed chlorination enzymes from soil bacteria in the Madagascar 666 periwinkle, a medicinal plant with prolific alkaloid production capabilities, to yield chlorinated 667 alkaloids [116]. By using enzymes to incorporate chemical changes once exclusively in the realm 668 of synthetic chemistry (fluorination and chlorination), these studies represent an important step 669 forward in the application of synthetic biology to expand the diversity of natural products.

670 For two of the major classes of natural products, the polyketides and the nonribosomal 671 peptides, the biosynthetic enzymes responsible for the synthesis of the natural product backbone 672 are modular. Further, the number and order of modules within the gene usually corresponding to 673 the number and order of chemical building blocks in the backbone molecule that becomes the 674 natural product [112, 117]. For these natural products, instead of combining different biosynthetic 675 enzymes as described above, combinatorial biosynthesis can be achieved by swapping modules 676 within a single enzyme as shown in Figure 4b. Thus protein engineering has been used to swap 677 modules in polyketide and nonribosomal peptide biosynthetic genes in further attempts to generate 678 unnatural products. This approach was used to make variants of the antibiotic daptomycin by 679 exploring module exchanges in dptD, a gene encoding a di-modular enzyme that incorporates the 680 monomers 3-methylglutamic acid and kynurenine into daptomycin. By replacing the kynurenine-681 specific module with modules specifying asparagine, the engineered nonribosomal peptide 682 synthetase now produces a structural variant of daptomycin with similar antibiotic properties [118]. 683 The ability to confer such structural diversity to existing antibiotics may prove fruitful in the fight 684 against antibiotic resistance.

685 For the most part, combinatorial biosynthesis for therapeutic drug development has 686 focussed on a single class of natural product. Recently however, an ambitious application of 687 synthetic biology for production of natural-product derived therapeutic molecules combined 688 biosynthetic enzymes from several different natural product classes. Klein and co-workers cloned a 689 myriad of biosynthetic enzymes from alkaloid, polyketide and flavonoid (a minor natural product 690 class) pathways, and expressed dozens of different combinations of these in the yeast S. 691 cerevisiae, using a novel recombination-based approach [119]. Over 75% of the resulting 74 692 compounds were new to science, and 20% were highly different, representing novel chemical 693 backbones. All of these exhibited structural complexity akin to that of natural products, and were 694 enriched for several other metrics of drug-likeness.

695

696 4. Future Outlook

697

698 One key area of synthetic biology research concerns designing 'synthetic cells'. One can envision 699 a future where synthetic cells are rationally tailored for the production of small molecules, with 700 customised cells made to fit the biosynthetic pathway in guestion. Efforts are already being made 701 in this direction, as evidenced by the recent construction of 'modular cells' and their application for 702 the production of various chemicals in customised E. coli [120]. Aside from synthetic genomes, 703 the synthetic cell concept also applies to subcellular compartments. Already progress has been 704 made to recapitulate naturally occurring bacterial micro-compartments (BMCs) and viral capsids 705 into the model host bacterium E. coli [121]. While both of these types of natural compartment have 706 been used to aid the production of small molecules the next conceptual step would be to design 707 synthetic sub-cellular compartments from the ground up, tailored to the optimal reaction conditions 708 of specific natural product pathways.

709 Another avenue being explored by synthetic biology takes an opposite conceptual direction. 710 Instead of adding compartments, in cell-free synthetic biology the aim is to remove the principle 711 compartment and carry out biological processes with defined cellular components. Cell-free 712 systems offer the advantages of building biological systems from the ground up for applications 713 such as metabolite synthesis rather than adapting existing biological systems for the task. One 714 major advantage of such an approach is that there is no need to optimise the background genome 715 of a host organism for better production. Further, it is often easier to fine-tune the performance of 716 multi-enzyme pathways such as those for most natural products in cell-free systems, as systems-717 level properties can be directly monitored in real-time [122].

718 For unknown natural products, future efforts will likely bring better computational 719 methods for characterising biosynthetic clusters from genomic and metagenomic DNA sequences. 720 Studies of the diversity of natural products in geographically distinct soil samples from around the 721 world suggest that natural product diversity is potentially much greater than appreciated from 722 microorganisms amenable to laboratory based culture [93]. Advances in molecular biology 723 methods for cloning and expressing these biosynthetic pathways should open up new routes to 724 harnessing the potential of natural products from the "microbial dark matter". In particular, methods 725 for cheaper, more efficient de novo DNA synthesis will greatly bolster efforts to express 726 biosynthetic pathways in heterologous hosts. For a more detailed discussion about advances in 727 this area, readers are pointed to the following recent review [123]. Finally, for "unnatural products". 728 progress is being made towards understanding the rules for rational redesign of the biosynthetic 729 machinery towards novel molecules with drug-like properties. Synthetic biology is likely to play a 730 key role in making enzyme design predictable.

731

732 5. Conclusions

733

Natural products have provided the basis for many of the most important drugs developed in the past century. However, the last two decades have witnessed a decrease in natural product based drug development by the pharmaceutical industry in favour of synthetic small molecule library screening. Nonetheless, the application of synthetic biology approaches such as those discussed in this review holds great promise for reviving and enhancing this great natural resource for ourbenefit in coming centuries, and also going beyond nature to produce new therapeutic molecules

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- 904

- 905 Figure Captions
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- 907

Figure 1. The major classes of natural product. The four major classes of natural product are
shown. For each class, a member with therapeutic properties is given along with the producing
organism.

911

912 Figure 2. Optimising Pathway Yield. a) Rational and semi-rational strategies for optimising 913 pathway yield in a heterologous host. Rational approaches include up-regulation of host metabolic 914 genes that produce a pathway precursor, and down-regulating genes in pathways that compete for 915 a synthetic pathway intermediate. Semi-rational approaches include using libraries of regulatory 916 elements and pathway enzymes to explore gene expression and enzyme kinetic space. b) Spatial 917 strategies include tethering pathway enzymes to a synthetic scaffold to control stoichiometry, and 918 compartmentalisation of pathway enzymes to control reaction conditions and enzyme and 919 substrate concentration. A third strategy involves a microbial co-culture of different species, each 920 containing part of the pathway. Co-culture can be implemented in a mutualistic fashion to maintain 921 both populations.

922

Figure 3. Mining (meta)genomic gene clusters for unknown natural products. a) It is
increasingly simple to sequence the genomes of laboratory grown or environmentally sampled.
These genomes sequences are searched for gene clusters indicative of unidentified natural
products. b) These gene clusters are refactored for expression in a heterologous host to produce
and identify the unknown natural product.

928

929 Figure 4. Creation of 'unnatural products'. a) Incorporating unnatural precursors. Substrate 930 promiscuity of natural product biosynthetic enzymes can lead to the incorporation of unnatural 931 precursors and chemical diversification of natural product backbones. b) Module swapping in 932 polyketide and nonribosomal peptide biosynthetic machinery. The biosynthetic enzymes of two 933 major classes of natural products are modular, with the number and order of modules specifying 934 the identity of the natural product. By swapping, adding or deleting modules within these enzymes 935 it is possible to create new compounds. c) Natural product biosynthetic genes from different 936 organisms can be combined with 'tailoring enzymes' to produce structurally diverse 'unnatural 937 products'.

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a) Precursor-directed biosynthesis

