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# Recent developments in self-resistance gene directed natural product discovery

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## Abstract

Natural products (NPs) are important sources of human therapeutic agents and pesticides. To prevent self-harm from bioactive NPs, some microbial producers employ self-resistance genes to protect themselves. One effective strategy is to employ a self-resistance enzyme (SRE), which is a slightly mutated version of the original metabolic enzyme, and is resistant to the toxic NP but is still functional. The presence of a SRE in a gene cluster can serve as a predictive window to the biological activity of the NPs synthesized by the pathway. In this highlight, we summarize representative examples of NP biosynthetic pathways that utilize self-resistance genes for protection. Recent discoveries based on self-resistance gene identification have helped in bridging the gap between activity-guided and genome-driven approaches for NP discovery and functional assignment.

## Graphic abstract



This review covers recent natural product research directed by self-resistance genes, which bridges the gap between activity-guided and genome-driven approaches.

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<sup>5.</sup> Conflicts of interest

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#### 1. Introduction

Natural products (NPs) are small organic molecules derived from secondary metabolism of living organisms, mostly found in microbes and plants. NPs have been evolutionally optimized to bind to specific but diverse macro-biomolecule targets, facilitated by their complex structures unrivalled by synthetic molecule libraries. As a result, NPs continue to inspire innovative discoveries in the field of chemistry, biology and medicine. From 1981 to 2014, among 1562 newly approved drugs, 710 were derived from NPs. Between 1997 and 2010, NPs and their derivatives made up approximately 36% of all new registered pesticide ingredients<sup>1, 2</sup>. NPs will remain an important source for discovering new human therapeutic agents or agrochemicals<sup>3</sup>.

In the past century, the rapid development of biological assays and chemical separation techniques has led to the identification and isolation of many bioactive NPs<sup>1, 2</sup>. In activity-guided NP discovery, a biomass or extract with bioactivity is first identified using an activity screen. The desired activity is enriched and tracked by several rounds of fractionation and purification, until a pure bioactive compound is obtained<sup>4</sup> (Fig. 1a). The most famous example is perhaps the serendipitous discovery of penicillin, identified through inhibition of bacterial growth. Such activity-guided discovery of NPs has remained a mainstay for almost a century, becoming more versatile with the development of higher-resolution and higher-throughput assays<sup>5</sup>.

The rapid development of genome sequencing technologies has revolutionized NP discovery<sup>6, 7</sup>. Extensive experimental studies of the biosynthetic genes of NPs showed that the genes encoding enzymes responsible microbial for biosynthesis of one NP are typically clustered in a genome as a biosynthetic gene cluster (BGC)<sup>8</sup>. This may facilitate coregulation, co-expression and horizontal transfer of all genes within a BGC together. With the clustering of biosynthetic genes and powerful bioinformatics tools<sup>9, 10, 11</sup>, tens of thousands of BGCs have been identified from sequenced microbial genomes. Identification of a BGC is typically performed first through cataloguing of anchoring biosynthetic core enzymes, such as polyketide synthases (PKSs), nonribosomal peptide synthetases (NRPSs), terpene synthases (TSs),  $etc^{12}$ , that build up the backbone of the molecules. Among identified BGCs, it is estimated that fewer than 10% are associated with characterized NPs, and the other >90% of gene clusters have unknown products<sup>13</sup>. This led to the common characterization of these BGCs as transcriptionally silent, cryptic and/or biosynthetic dark matter. The lack of production of NPs from these BGCs can be attributed to several reasons: 1) the production of many NPs in native strains is in responses to complex combinations of environmental and growth signals, which are difficult to recapitulate under axenic laboratory culturing conditions; 2) some NPs are only produced at very low concentrations, which could elude detection; and 3) the biological activities of the NPs are not targeted during activity-guided screens, and thereby overlooked during extract analysis. Uncovering the structures and activities of the >90% cryptic BGCs of unknown products is therefore a tantalizing new approach of drug discovery.

In the last decade, genome-driven NP discovery approaches have led to the effective mining of these cryptic BGCs<sup>14</sup> (Fig. 1b). The application of modern cloning and synthetic biology

tools, which include overexpression of pathway-specific transcription factors, epigenetic modification of chromatin structure, and heterologous expression of pathways in model hosts, have demonstrated there is significant potential to increase the NP structure space from microbes<sup>11, 15–17</sup>. Although many NPs with new structures have been discovered using genome mining approaches, the molecular targets and biological functions of these NPs are not easily identified. This is because genome mining efforts have been generally targeting the presence of interesting biosynthetic enzymes and from ecologically unique species, and are not activity-guided. As there are exponential increases in the number of cryptic BGCs, the challenge is to prioritize BGC mining with biological activity to identify the most therapeutically promising NPs<sup>18</sup>.

How can we predict the activity of a NP based on a genomic sequence? The answer to this question can help us pinpoint the untapped bioactive NPs from microbial secondary metabolism. In this review, we will summarize the occurrence of self-resistance genes in characterized BGCs. We will then highlight the use of the self-resistance gene as a predictive window for linking BGCs to NP activities, and to mine NPs with desired activity. In our opinion, this approach could be effective in leading the renaissance of NP discovery for novel human therapeutic agents and agricultural chemicals.

## 2. Self-resistance gene co-localized with BGC implies the molecular target

## of a NP

Many NPs are believed to be produced by organisms (the host) to kill or limit the growth of competitor organisms through the inhibition or inactivation of essential housekeeping enzymes. However, if the same enzyme target is conserved in the producing organism and is essential, the NP will also be toxic to the producing host. Therefore, self-protecting methods must be present in the host to confer resistance to the biosynthesized NPs. Several mechanisms of self-resistance are known, including efflux pumps that actively transport the metabolites to extracellular space; resistance proteins that are present to sequester or modify highly active NPs that remain in the cell; and enzymes that modify housekeeping enzymes in the host to evade NP inhibition<sup>19, 20</sup>. The accumulating knowledge of self-resistance mechanisms have facilitated NP research. For example, Wright and co-workers designed a resistance-based NP discovery platform for the discovery of novel antibiotics<sup>21</sup>. This platform can be summarized in the following steps: 1. Screening of environmental samples using desired antibiotic to enrich microbial producers of selected antibiotic scaffolds; 2. Determining the presence of a desired BGC in unique microbial isolates using polymerase chain reaction (PCR)-based screening; 3. Further phylogenetic analysis of the producers of new NPs

An additional strategy nature employs for self-resistance is to encode a functionally equivalent, self-resistance enzyme (SRE) that is a variant of the housekeeping enzyme. The SRE is highly similar in sequence to the housekeeping target, but contains mutations that render the enzyme insensitive to NP inhibition, while still maintaining activity<sup>22, 23</sup>. Because of the sequence similarities, the functions of SREs can be readily predicted through bioinformatic analysis. The SRE is often co-clustered with the BGC of the NP and is

transcriptionally co-regulated with the biosynthetic genes during NP production. This ensures the SRE is present when the NP starts to accumulate intracellularly. The use of SRE strategy is widely adopted by NP producing microorganisms in both bacterial and fungal species<sup>22, 23</sup>.

From a genome mining perspective, the SRE effectively serves as a readout of the enzyme target of the associated NP. Here we summarize 36 examples of SRE co-localizations, which are grouped into different modes of action of NPs (Table 1). Among these 36 examples, 24 proposed SREs have been functionally validated by either *in vivo* or *in vitro* experiments (Table 1). The examples demonstrate co-localization of biosynthetic and SRE genes is prevalent for NP producing microorganisms.

#### 2.1 Inhibitors of DNA replication

DNA replication is a fundamental life process that produces identical copies of DNA molecules using the original chromosome in a template process. This process requires multiple enzyme complexes in coordination to achieve high efficiency and accuracy. This process and the enzymes involved are highly conserved among prokaryotes, while divergent in eukaryotes. Therefore, bacterial DNA replication enzymes are ideal targets for mining antibacterial agents<sup>24</sup>. The first NP identified to target DNA replication process was novobiocin (1), which was isolated in 1955 and used as an anti-infection agent in clinical treatment of *Staphylococcus*<sup>25</sup> (Fig. 2). The enzyme target of 1 was determined to be DNA gyrase, which belongs to a subclass of type II topoisomerase<sup>26</sup>. This enzyme unwinds double-stranded DNA by reducing the topological strain in an ATP dependent manner<sup>27</sup>. Biosynthetic studies of 1 revealed the *gyrB* gene present within the BGC encodes a variant of the housekeeping DNA gyrase that is not sensitive to  $1^{28, 29}$  (Table 1). Co-localization of self-resistant DNA gyrase variants were also found in BGCs of other DNA gyrase inhibitors, such as chlorobiocin (2)<sup>30</sup> and coumermycin A1 (3)<sup>31</sup> (Fig. 2 and Table 1).

#### 2.2 Inhibitors of protein biosynthesis

Enzymes involved in protein biosynthesis are classic targets for the development of antibacterial agents because of the well-studied functional differences between prokaryotes and eukaryotes<sup>32</sup>. During protein biosynthesis, transfer RNAs (tRNAs) are first aminoacylated by the cognate amino acids by the 20 aminoacyl-tRNA synthetases (aaRSs). There are several NPs targeting different aaRSs including mupirocin (**5**) (IleRS) <sup>33</sup>, <sup>34</sup>, thiomarinol (**6**) (IleRS)<sup>35</sup>, cladosporin (**7**) (LysRS)<sup>36</sup>, borrelidin (**8**) (ThrRS)<sup>37</sup>, albomycin  $\delta^2$  (**9**) (SerRS)<sup>38</sup>, indolmycin (**10**) (TrpRS)<sup>39</sup> and agrocin 84 (**11**) (LeuRS)<sup>40, 41</sup> (Fig. 3). Among these natural inhibitors, **5** is approved by the FDA to treat a skin infectious disease impetigo, and **7** is a FDA approved drug against malarial parasites. To prevent inhibition of housekeeping aaRSs by these potent inhibitors, the producing strains of these NPs encode mutated versions of corresponding aaRSs as SREs in the BGCs<sup>34–38, 41</sup> (Table 1).

Many classic NPs inhibit the translation process at the ribosome, including tetracyclines, erythromycins, etc. The producers of these well-studied NPs use different mechanisms of self-resistance as noted earlier. The use of SRE for host protection of ribosomal inhibitors is also a widely adopted strategy. Thiopeptides such as thiocillin (**12**) perturb translation by

rubradirin (13) can selectively bind to one specific translation initiation factor to arrest protein biosynthesis<sup>44</sup> (Fig. 3). Similar to 12, two identical copies of the translation initiation factor in the BGC are proposed to protect the host during biosynthesis of  $13^{45}$  (Table 1). Similarly, identification of BGCs of NPs thiomuracin (15)<sup>46</sup> and GE2270 (14)<sup>47</sup> that inhibit elongation factors Tu (EF-Tu) revealed both clusters contain genes encoding variants of housekeeping EF-Tu as SREs (Fig. 3 and Table 1).

Most nascent proteins synthesized by ribosome require post-translational modifications to become mature and fully functional. One required modification in bacteria is removal of *N*-terminal methionine residue catalysed by methionine aminopeptidase (MetAP). A bacterial antibiotic bengamide B (**16**) produced by *Myxococcus virescens* is able to block type I MetAP<sup>48</sup> (Fig. 3). Experimental studies of the type I MetAP variant encoded within the corresponding BGC confirmed it can confer self-resistance in the presence of **16**<sup>49</sup> (Table 1). The presence of MetAP variants as SREs is also observed in the BGC of fumagillin (**17**), which is a fungal MetAP inhibitor produced by *Aspergillus fumigatus*. Interestingly, two proposed SREs are encoded in the cluster, which correspond to additional copies of type I and type II MetAP<sup>50</sup> (Fig. 3 and Table 1).

#### 2.3 Inhibitors of protein degradation

Protein degradation is a cellular process that controls the intracellular concentration of proteins and enzymes, and is a key checkpoint for programmed cell death. Accurate and timely protein degradation is catalysed by protein complexes known as proteasomes. Disorder of a proteasome subunit is lethal to the organism. Salinosporamide A (**18**), isolated from a marine bacteria *Salinispora tropica*, is able to covalently inactivate proteasome subunit beta through a  $\beta$ -lactone ring opening step <sup>51</sup> (Fig. 4a). In the BGC of **18**, an additional, mutated copy of the proteasome subunit beta was encoded. Functional assays confirmed the additional copy is indeed a SRE that confers resistance to **18**<sup>52</sup> (Table 1). Moore and coworkers showed that the SRE contains a single A49V mutation, which has been shown to constrict the S1 binding pocket and hinder **18** binding<sup>52</sup>. The biosynthesis of proteasome inhibitor eponemycin (**19**), produced by *Streptomyces hygroscopicus*, also involves the use of a mutated copy of proteasome subunit beta in the BGC that functions as SRE<sup>53</sup> (Fig. 4a and Table 1). Although **19** itself is not further developed into a new drug, the epoxyketone warhead of **19** was used to design the FDA approved therapeutic agent Carfilzomib that targets the proteasome in the treatment of multiple myeloma<sup>54</sup>.

#### 2.4 Inhibitors of lipid metabolism

Lipids are essential biomolecules involved in formation of cellular membranes, energy storage and signal transduction, etc. Therefore, most enzymes involved in the synthesis and degradation of lipids are essential to living organisms. A number of BGCs producing NPs targeting the fatty acid biosynthetic pathway encode SREs to confer self-resistance. For example, andrimid (**21**) targets acetyl-coenzyme A (acetyl-CoA) carboxylase, which

catalyses the synthesis of malonyl-CoA via carboxylation of acetyl-CoA<sup>55</sup> (Fig. 4b). A second copy of acetyl-CoA carboxylase in the BGC of **21** was validated to be the self-resistance-gene<sup>56, 57</sup> (Table 1). Both platensimycin (**22**)<sup>58</sup> and platencin (**23**)<sup>59</sup> produced by *Streptomyces platensis* are potent inhibitors of FabF, the beta-ketoacyl-acyl carrier protein synthase II in fatty acid biosynthesis (Fig. 4b). The FabF homologs encoded within **22** and **23** BGCs have been demonstrated to be SREs<sup>60, 61</sup> (Table 1). The bacterial polyketide kalimantacin (**24**) inhibits FabI, the enoyl-acyl carrier protein reductase in the fatty acid biosynthetic pathway<sup>62</sup> (Fig. 4b). The second copy of *fabI* co-localized with **24** biosynthetic genes was verified to be the self-resistance gene<sup>62</sup> (Table 1).

In addition to fatty acids, steroids and steroid alcohols are also lipids that function as vital components of cell membranes or signalling molecules in microorganisms. Both cholesterol (used by animals) and ergosterol (used by fungi and protozoa) are derived from triterpene precursors such as squalene, which in turn are polymerized from isopentenyl pyrophosphate build blocks derived from the mevalonate pathway. Whereas the ergosterol pathway in fungi is the target of antifungal drugs such as azoles<sup>63</sup>, the cholesterol biosynthetic pathway in humans has been a very successful target for treating hypercholesterolemia<sup>64</sup>. One of the most famous and successful fungal NPs, lovastatin (25), targets the rate limiting step of the mevalonate pathway, 3-hydroxy-3-methylglutaryl-coenzyme A reductase (HMGR). 25 is an approved drug (Mevacor) that treats high blood cholesterol levels<sup>65</sup> (Fig. 4b), and has inspired the development of both semisynthetic and synthetic statin drugs. 25 is synthesized by the lov BGC from Aspergillus terreus, presumably to target the sterol biosynthetic pathways of competing fungal species. In the middle of the lov BGC is a second copy of the gene encoding a putative HMGR, and is demonstrated to confer self-resistance<sup>66, 67</sup> (Table 1). Other NPs inhibiting the sterol biosynthetic pathway have been explored as potential cholesterol-lowering drugs. One notable example is zaragozic acid (26) that inhibits squalene synthase, the enzyme that dimerizes farnesyl diphosphate to afford squalene<sup>68</sup> (Fig. 4b). As squalene synthase is vital to the producing fungus, a gene encoding a slightly mutated squalene synthase was found to be co-localized in the gene cluster, although the functional role as an SRE has not been verified<sup>69, 70</sup> (Table 1).

#### 2.5 Inhibitors of carbohydrate and energy metabolism

Not surprisingly, the central metabolism of microorganisms is heavily targeted by NPs in microbial warfare, including both anaerobic (glycolysis) and aerobic (respiration) processes. Because of the highly conserved enzymes in metabolism across species, SREs are commonly found in biosynthetic pathways of producing hosts. For example, glyceraldehyde-3-phosphate dehydrogenase (GAPDH) catalyses the sixth step of glycolysis, which converts glyceraldehyde 3-phosphate to the high energy D-glycerate 1,3-bisphosphate in an NAD<sup>+</sup> dependent fashion. There are currently two known NPs, the bacterial pentalenolactone (**29**)<sup>71</sup> and fungal heptelidic acid (**30**)<sup>72</sup>, that can covalently inactivate GAPDH using an epoxide moiety as a warhead targeting the active site cysteine (Fig. 4c). In the BGC of both NPs, an additional copy of GAPDH has been found and is verified to serve as SRE<sup>73, 74</sup> (Table 1). At the end of aerobic respiration, adenosine triphosphate (ATP) synthase is an essential enzyme to generate ATP driven by the electrochemical gradient. Two structurally similar fungal NPs, aurovertin E (**31**)<sup>75, 76</sup> and citreoviridin (**32**)<sup>77</sup>, produced by

*Metarhizium anisopliae* and *A. terreus,* target ATP synthase beta chain as noncompetitive inhibitors<sup>75</sup> (Fig. 4c). An additional mutated copy of ATP synthase beta chain is encoded by the BGC of each molecule, presumably to protect the producing hosts<sup>76, 78</sup> (Table 1).

#### 2.6 Inhibitors of amino acid metabolism

Phaseolotoxin (**33**) isolated from plant pathogen *Pseudomonas syringae* is a potent irreversible inhibitor of ornithine carbamoyltransferase in the arginine biosynthetic pathway<sup>79</sup> (Fig. 4d). **33** is a devastating toxin in agriculture, because it leads to halo blight disease that caused loss of beans production worldwide<sup>80</sup>. The producing organism is able to survive during NP production by co-expressing a mutated ornithine carbamoyltransferase SRE, which is confirmed to be insensitive to this toxin<sup>81, 82</sup> (Table 1).

#### 2.7 Inhibitors of nucleotide metabolism

Inosine-5'-monophosphate dehydrogenase (IMPDH) catalyses the first step of guanine biosynthesis. Inhibition of this pathway has been effective in arresting the development of lymphocytes due to de novo biosynthesis of guanine, and is the only way to supply both adenosine monophosphate (AMP) and guanosine monophosphate (GMP) in these cells. The fungal NP mycophenolic acid (**35**) targeting this enzyme was approved by FDA as an immunosuppressant to prevent rejection during organ transplantation<sup>83</sup> (Fig. 4e). Biosynthesis studies of **35** in *Penicillium brevicompactum* revealed a second copy of IMPDH is encoded in the BGC as a SRE<sup>84</sup> (Table 1).

#### 2.8 Inhibitors of xenobiotics biodegradation

Xenobiotics are substances that are not naturally produced within the host cells such as some environmental toxins, external antibiotics or synthetic chemicals. Biodegradation of these xenobiotic compounds is often a necessary process to ensure the survival of the host.  $\beta$ lactam antibiotics are commonly produced by microorganisms as cell wall biosynthesis inhibitors and are widely used as antibiotics. In nature, an evasive strategy employed by bacteria is to evolve  $\beta$ -lactamase that can cleave the  $\beta$ -lactam compounds and become resistant. Interestingly, nature has evolved NPs that can inhibit  $\beta$ -lactamase which renders the organisms sensitive again. This has led to the co-use of both  $\beta$ -lactams and  $\beta$ -lactamase inhibitors to overcome clinical resistance. Cephamycin C (**36**), produced by *Streptomyces clavuligerus*, is such a NP<sup>85</sup> (Fig. 4f). In the BGC of **36**, a mutated copy of  $\beta$ -lactamase is co-expressed and is not sensitive to **36**<sup>86</sup> (Table 1).

#### Recent studies on natural products using a resistance gene directed

#### approach

The above examples illustrate that the co-localizations of SRE genes within the BGC is a common occurrence. Most importantly, the identification of a putative SRE gene in the BGC through bioinformatic analysis or functional verification can connect the encoded NP to a potential target. The SRE, if predicted correctly, can therefore be a powerful predictive window to the bioactivity of a NP. This has several important implications to genome mining (Fig. 5): i) If the activity of the compound is already known, searching for a BGC with a

potential resistance gene can help locate the gene cluster; ii) Many NPs are discovered without a molecular target. If a BGC is identified and contains a potential SRE, this can connect the molecule to its activity; and iii) Using a molecular target as a query, searching for BGCs that contain a corresponding SRE can lead to target-guided genome mining. Here we will highlight recent examples of using SREs in these three approaches.

#### 3.1 Locating the BGCs of NPs with known biomolecular targets

With both the structure and activity of a NP elucidated, one can use both information as probes to locate the BGCs (Fig. 5a). For example, the BGC of gyrase inhibitor **3** was located in the producing strain *Streptomyces rishiriensis* by identifying BGC that contains both the biosynthetic core gene dTDP-glucose 4,6-dehydratase and the self-resistance-gene  $gyrB^{20, 23}$ . The latter was hinted from the presence of a SRE in the BGC of a related compound **1**. In an example from fungi, the BGC of IMPDH inhibitor **35** was located within the producing strain *Penicillium brevicompactum* (Fig. 4e). The biosynthetic origin of **35** was not immediately clear at the onset of the study<sup>83</sup>, and core enzymes were not useful in pinpointing the BGC<sup>83, 84</sup>. Although there was no precedent of BGCs encoding IMPDH inhibitors requiring a SRE, the authors proposed that a homolog of IMPDH may be present to confer resistance to **35**<sup>84</sup>. Based on this hypothesis, the BGC of **35** was successfully discovered using the IMPDH gene as a probe.

An example of using a SRE to locate a gene cluster from our lab is that of the fungal MetAP2 inhibitor  $17^{50}$ . It is known that the bis-epoxide cyclohexanol portion of 17 (fumagillol) is derived from a farnesyl diphosphate precursor<sup>87</sup>. When we searched through the sequenced and annotated A. fumigatus genome for BGCs containing canonical sesquiterpene cyclases, no suitable BGC could be identified. Suitability here refers to the presence of expected tailoring enzymes that match the structure of 17. An alternative strategy was to search for additional copies of MetAP, which was an elucidated target of  $17^{88}$ . In doing so, a BGC on the eighth chromosome was identified to contain additional copies of both MetAP1 and MetAP2. While the BGC encoded a multitude of tailoring enzymes, as well as a PKS that could synthesize the dioic acid, no terpene cyclase was found. Further detailed annotation of the gene cluster revealed that one gene was misannotated. Upon correction of the 5' region assignment, the gene was reannotated as a putative membrane bound prenyltransferase with weak sequence homology to UbiA. Biochemical characterization of the enzyme demonstrated it is a new type of sesquiterpene cyclase that synthesizes the 17 precursor  $\beta$ -*trans*-bergamotene<sup>50</sup>. All the remaining genes in the BGC were characterized to be responsible for synthesizing 17 by both the Keller group and our group<sup>50, 89, 90</sup>. This example illustrates the utility of using the SRE hypothesis to find BGCs that may otherwise be difficult to identify using a core enzyme alone.

#### 3.2 Discovering the biomolecular targets of known NPs

Besides locating the BGC of a NP of known bioactivity, the SRE presence in a BGCs can also reveal the bioactivity of discovered NPs (Fig. 5b). For example, **24** isolated from *Pseudomonas fluorescens* were identified to be promising novel antibacterial agents with a strong selective anti-staphylococcal activity (Fig. 4b). The mechanism of action of **24** however, had remained unknown<sup>62</sup>. When characterizing the function of each gene within

the BGC, the Lavigne group observed a knockout of BatG, a predicted FabI isozyme, did not affect the production of this antibiotic. On the other hand, heterologous expression of BatG in a **24** sensitive host conferred this host resistance to **24**<sup>62</sup>. FabI is an essential metabolic enzyme that functions as a *trans*-2-enoyl-ACP reductase in the fatty acid biosynthetic pathway. Thus they proposed the molecular target of **24** is FabI, and BatG is able to complement the function of FabI during production of **24**<sup>62</sup> (Table 1). One may ask how the original host can survive when *batG* is inactivated, since the SRE is no longer present. It may be that the housekeeping copy of FabI has already accumulated some mutations to gain resistance to **24**, and the SRE is an additional safeguard. This may explain why there is not always an additional copy of the SRE in the BGCs of the bioactive NP. The ability of the housekeeping copy to be resistant may already be built in during evolution, and render SRE unnecessary. However, identification of these self-resistant housekeeping copies will need higher resolution bioinformatic analysis.

In another example, griselimycin (4) is a cyclic peptide isolated from *Streptomyces* strains in 1960s (Fig. 2). Although it has excellent broad spectrum antibacterial activity including against *Mycobacterium tuberculosis* that causes tuberculosis (TB), further development of this NP as an anti-TB drug was impeded because of its poor pharmacokinetics properties<sup>91</sup>. While analogues of **4** were synthesized and tested, however, efforts were abandoned when rifampin became available to treat TB<sup>92</sup>. Without knowledge of the mode of action, further medicinal chemical development for activity improvement was difficult. Recently, Kling et al. discovered the molecular target of **4** is DNA polymerase sliding clamp DnaN, which was hinted by a DnaN homolog encoded in the BGC that was confirmed to be the SRE<sup>93</sup> (Table 1). This discovery unveiled a novel mode of action of **4**, and resurrected its promising potential to be developed into a new anti-TB drug. This research outcome again indicated that the BGCs of NPs contain much more information than just the biosynthetic pathway: it is not just limited to how a NP is made, but also how that NP functions.

#### 3.3 (Re)discovering NPs with desired biomolecular targets

While the above examples successfully leveraged the SRE presence to connect NPs to the biological activity, the more useful application of a SRE is to accurately connect biological activity and genomic information in target-guided mining of NPs. The concept is to use SREs as a predictive window to help prioritize and identify BGCs that encode a NP inhibiting the desired target. This effectively bridges the gap discussed earlier between activity-guided screening and untargeted genome mining. A workflow of resistance-gene directed NP discovery could be proposed as follows: 1) Identifying a desired drug or pesticide target that is also essential and conserved in microorganisms of interest; 2) Searching through a genome database for BGCs carrying duplicate copies of the target using desired biosynthetic core enzymes; 3) Activating the biosynthetic genes to produce the NP using various synthetic biology tools; 4) Isolating the NP and determining its structure via multiple analytical chemistry techniques. 5) Validating the bioactivity of NP using in vitro biochemical assays of housekeeping enzymes or in vivo growth inhibition assays of a susceptible heterologous host with or without expressing SRE (Fig. 5c). This can be a general workflow to perform resistance-gene directed NP discovery using a genomic database.

To identify BGCs associated with SREs for genome mining, new bioinformatic tools are being developed with more efficient search algorithms. Ziemert and co-workers developed a web-based genome mining tool Antibiotic Resistant Target Seeker (ARTS), which specifically uses SRE-directed approaches for NPs discovery in bacteria<sup>94</sup>. The user provides genomic data of an organism of interest as input, and the putative BGCs that could produce NPs to inhibit all possible targets will be displayed in a dynamic graphic as an output. This search algorithm processes data in the following steps: 1) The genome will first be processed by automated genome mining tools to detect BGCs based on biosynthetic core genes; 2) The putative resistance genes will be located according to known self-resistance models and duplication of essential housekeeping genes, which is validated by phylogenetic analysis of horizontal gene transfer; 3) The BGCs co-localized with a self-resistance gene will be screened and highlighted as an output, which are summarized into an interactive output table to rapidly visualize both known and putative targets. Although ARTS is currently focused on actinobacteria, the methodology of this automated pipeline can be extended to other organisms to prioritize genome mining based on potential bioactivity.

Another genome mining software, clusterTools, developed by Challis and co-workers also enables *in silico* resistance-gene directed NP discovery<sup>95</sup>. Compared to existing bioinformatics tools, clusterTools is designed to identify putative BGCs of interest using Hidden Markov Models (HMMs) of specific functional elements. A customized search can be performed with inputs of HMMs including not only functional domains of biosynthetic core enzymes and tailoring enzymes, but also other elements such as resistance or regulatory genes. This software enables a more precise biosynthetic-hypothesis driven and resistancegene directed search of BGCs at the same time.

Recently, Andersen and co-workers developed a similar pipeline to perform resistance-gene directed genome mining from fungal species<sup>96</sup>. 72 unique putative resistance genes and clusters were identified by applying the search algorithm to 51 *Aspergillus* and *Penicillium* species.

The first detailed experimental methodology was performed by Moore's group<sup>97</sup>. They successfully discovered a group of FASII inhibitors using their search pipeline to identify NPs that may inhibit parts of the fatty acid biosynthetic pathway. The pipeline can be summarized as follows: 1) Possible self-resistance gene were selected from duplicate members within delineated orthologous groups in the pan-genome of 86 *Salinispora* strains; 2) One PKS44 cluster was identified to contain a putative SRE, which is a homolog of fatty acid biosynthetic enzyme; 3) This PKS44 cluster was reconstituted in a heterologous host *Streptomyces coelicolor*, which produced a group of thiolactomycins (**27**) that were previously reported as FASII inhibitors<sup>98</sup> (Fig. 4b and Table 1). Following a similar procedure, the thiotetroamide C (**28**) gene cluster was also identified in *Streptomyces afghaniensis*<sup>97, 99</sup> (Fig. 4b and Table 1); and 4) The putative self-resistance genes *ttmE* and *ttmJ* were verified to aid the heterologous host to survive in the presence of **28**<sup>97</sup>. The output of this pipeline demonstrated the practicality to perform a self-resistance-gene directed approach to find NPs with desired mode of action.

The proteasome inhibitor fellutamide B (**20**) was rediscovered by Yeh and co-workers guided by a putative resistance gene encoding a proteasome component C5 homolog<sup>100</sup> (Fig. 4a and Table 1). First, the authors identified a BGC in *Aspergillus nidulans* that contains the gene *inpE* that encodes a putative proteasome subunit. This cluster was then activated by a serial promoter replacement to produce the NP **20**, which was previously characterized to be a potent proteasome inhibitor<sup>101</sup>. Finally *inpE* was demonstrated to confer self-resistance to **20** by in vivo studies<sup>100</sup>.

Notwithstanding the above examples of SRE-directed mining, the rediscovery of **27**, **28** and **20** led to known NPs with previously established modes of action. In the last few years, a couple of examples have emerged for the discovery of NPs with previously unknown targets. For example, Müller's group discovered novel topoisomerase inhibitors from myxobacteria using topoisomerase-targeting pentapeptide repeat protein (PRP) as a probe<sup>102</sup>. This SRE was previously observed in BGCs of gyrase inhibitors albicidin and cystobactamid. A BGC encoding a polyketide metabolite was identified to contain a PRP in the genome of *Pyxidicoccus fallax*. Two new NPs, pyxidicycline A and B, were produced upon mutating the promoters of polyketide synthase genes. Bioactivity studies confirmed both pyxidicycline A and B are selective inhibitors of topoisomerases. Although the resistance gene here is not directly a mutated copy of the targeted housekeeping topoisomerase, this example validated the possibility of using SREs to discover new NPs with desired bioactivities.

We applied target-guiding genome mining to find herbicide leads with a new mode of action from a fungal genomic database. We targeted the enzyme dihydroxy-acid dehydratase (DHAD), the third enzyme in the branched chain amino acid biosynthesis pathway $^{103}$ . The first enzymes on this pathway, acetolactate synthase is the most targeted enzyme for herbicide development with over 50 commercialized agents. However, there is no inhibitor of DHAD that has been reported to work in planta. After confirming DHAD enzymes in plants are close homologs of the housekeeping fungal DHADs, we scanned fungal genomes in publicly available databases for a BGC that encodes a possible SRE copy of DHAD. We located a conserved gene cluster that encodes a duplicate copy of DHAD that is ~60% identical to the well-conserved housekeeping DHAD present in all fungi. The biosynthetic core genes from Aspergillus terreus were then reconstituted in a heterologous host to produce aspterric acid (34), a known sesquiterpene NP with unknown biological target<sup>104</sup> (Fig. 4d, Table 1). We demonstrated that **34** is a competitive inhibitor of DHAD, and the SRE AstD is indeed resistant to 34. The broad spectrum herbicidal activities of 34 were then confirmed using a variety of model plant species. Furthermore, we introduced astD into Arabidopsis thaliana to construct a transgenic plant that is resistant to 34. The combination of the compound with new mode of action and a resistant plant makes 34 a promising herbicide lead. Finally, the structure of A. thaliana DHAD was solved and the homology structure of AstD was modelled, which showed the active site entrance in AstD may be significantly narrowed to prevent binding of **34**. Our rediscovery of **34** with the target-guided mining demonstrates this approach can indeed lead to NPs with novel modes of action.

#### 4. Conclusions and prospects

The rapid development of genome sequencing technologies has reinvigorated NP discovery using genome-mining approaches. The duplicated and insensitive SREs co-localized with NP BGCs likely co-evolved with the biosynthetic pathways of NPs. While study of the molecular mechanism of how SREs are insensitive can lead to new insights in how nature evolves resistance to powerful antibiotics, the SRE provides a unique window to predict the biological activities of NPs<sup>22, 23</sup>.

However, it is important to note that our limited biosynthetic knowledge means that prediction of a self-resistance gene in a BGC could sometimes be inaccurate. Using an example from our lab, when we tried to discover a new IMPDH inhibitor using the presence of a SRE, we recently discovered a BGC that synthesizes the PKS-NRPS product pyranonigrin A. However, pyranonigrin A was shown not to be an IMPDH inhibitor<sup>105</sup>. Therefore, a housekeeping enzyme homologue could be coincidently duplicated in the BGC of a NP and does not serve as a SRE.

In other cases, a housekeeping enzyme variant in a BGC could be bona fide biosynthetic enzyme that involved in the assembly of NPs rather than a SRE. For example, similar to that of 9, a second copy of seryl-tRNA synthetase is located within the valanimycin BGC. However, further characterization of the function revealed that this seryl-tRNA synthetase is responsible for catalysing seryl transfer in the valanimycin biosynthetic pathway<sup>106</sup>. In another recent example, Abe and coworkers discovered the BGC of an Ile-tRNA synthetase (IleRS) inhibitor SB-203208 in Streptomyces sp. NCIMB 40513 using the presence of an SRE copy of IleRS as a search criterion<sup>107</sup>. Surprisingly, the additional copy of IleRS (SbzA) in the BGC was demonstrated to participate in the biosynthetic steps of SB-203208. Therefore, it is challenging to accurately predict true SREs, especially for enzymes that may play functional roles in the biosynthetic pathway. However, we expect this to be less ambiguous as we build up more knowledge in biosynthetic enzymology. The accumulating knowledge of self-resistance mechanisms in the future will also facilitate new automated bioinformatics tools to prioritize cryptic BGCs with higher accuracy. We expect a selfresistance-gene guided approach to bridge the traditional and modern methods of NP discovery during this exciting period of NP renaissance.

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## Biography



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#### 7. References

- 1. Newman DJ and Cragg GM, J. Nat. Prod, 2016, 79, 629-661. [PubMed: 26852623]
- 2. Cantrell CL, Dayan FE and Duke SO, J. Nat. Prod, 2012, 75, 1231–1242. [PubMed: 22616957]
- 3. Yan Y, Liu Q, Jacobsen SE and Tang Y, EMBO Rep., 2018, 19, e46824. [PubMed: 30361392]
- 4. Henke MT and Kelleher NL, Nat. Prod. Rep, 2016, 33, 942–950. [PubMed: 27376415]
- 5. Lobanovska M and Pilla G, Yale J Biol Med, 2017, 90, 135-145. [PubMed: 28356901]
- Harvey AL, Edrada-Ebel R and Quinn RJ, Nat. Rev. Drug Discov, 2015, 14, 111–129. [PubMed: 25614221]
- 7. Van Lanen SG and Shen B, Curr. Opin. Microbiol, 2006, 9, 252–260. [PubMed: 16651020]
- Nützmann H-W, Scazzocchio C and Osbourn A, Annu. Rev. Genet, 2018, 52, 159–183. [PubMed: 30183405]
- Kim HU, Blin K, Lee SY and Weber T, Curr. Opin. Microbiol, 2017, 39, 113–120. [PubMed: 29156309]
- 10. Medema MH and Fischbach MA, Nat. Chem. Biol, 2015, 11, 639-648. [PubMed: 26284671]
- 11. Rutledge PJ and Challis GL, Nat. Rev. Microbiol, 2015, 13, 509-523. [PubMed: 26119570]
- Cimermancic P, Medema Marnix H., Claesen J, Kurita K, Brown Laura C. Wieland, Mavrommatis K, Pati A, Godfrey Paul A., Koehrsen M, Clardy J, Birren Bruce W., Takano E, Sali A, Linington Roger G. and Fischbach Michael A., Cell, 2014, 158, 412–421. [PubMed: 25036635]
- 13. Walsh CT and Fischbach MA, J. Am. Chem. Soc, 2010, 132, 2469–2493. [PubMed: 20121095]

- 14. Lautru S, Deeth RJ, Bailey LM and Challis GL, Nat. Chem. Biol, 2005, 1, 265–269. [PubMed: 16408055]
- Clevenger KD, Bok JW, Ye R, Miley GP, Verdan MH, Velk T, Chen C, Yang K, Robey MT, Gao P, Lamprecht M, Thomas PM, Islam MN, Palmer JM, Wu CC, Keller NP and Kelleher NL, Nat. Chem. Biol, 2017, 13, 895–901. [PubMed: 28604695]
- 16. Zhang JJ, Tang X and Moore BS, Nat. Prod. Rep, 2019, DOI: 10.1039/c9np00025a.
- 17. Hopwood DA, Chem. Rev, 1997, 97, 2465–2498. [PubMed: 11851466]
- 18. Ziemert N, Alanjary M and Weber T, Nat. Prod. Rep, 2016, 33, 988–1005. [PubMed: 27272205]
- Galm U, Hager MH, Van Lanen SG, Ju J, Thorson JS and Shen B, Chem. Rev, 2005, 105, 739– 758. [PubMed: 15700963]
- 20. Weisblum B, Antimicrob. Agents Chemother, 1995, 39, 577-585. [PubMed: 7793855]
- Thaker MN, Wang W, Spanogiannopoulos P, Waglechner N, King AM, Medina R and Wright GD, Nat. Biotechnol, 2013, 31, 922–927. [PubMed: 24056948]
- 22. Almabruk KH, Dinh LK and Philmus B, ACS Chem. Biol, 2018, 13, 1426–1437. [PubMed: 29763292]
- 23. O'Neill EC, Schorn M, Larson CB and Millán-Aguiñaga N, Crit. Rev. Microbiol, 2019, DOI: 10.1080/1040841x.2019.1590307, 1–23. [PubMed: 30628529]
- 24. van Eijk E, Wittekoek B, Kuijper EJ and Smits WK, J Antimicrob. Chemother, 2017, 72, 1275–1284. [PubMed: 28073967]
- 25. Smith CG, Dietz A, Sokolski WT and Savage GM, Antibiot. Chemother, 1956, 6, 135-142.
- 26. Maxwell A, Mol. Microbiol, 1993, 9, 681–686. [PubMed: 8231802]
- 27. Pommier Y, Leo E, Zhang H and Marchand C, Chem. Biol, 2010, 17, 421–433. [PubMed: 20534341]
- Steffensky M, Mühlenweg A, Wang Z-X, Li S-M and Heide L, Antimicrob. Agents Chemother, 2000, 44, 1214–1222. [PubMed: 10770754]
- 29. Thiara AS and Cundliffe E, Gene, 1989, 81, 65-72. [PubMed: 2553539]
- 30. Pojer F, Li S-M and Heide L, Microbiology, 2002, 148, 3901–3911. [PubMed: 12480894]
- Wang Z-X, Li S-M and Heide L, Antimicrob. Agents Chemother, 2000, 44, 3040–3048. [PubMed: 11036020]
- 32. McCoy LS, Xie Y and Tor Y, Wiley Interdiscip. Rev. RNA, 2011, 2, 209–232. [PubMed: 21957007]
- El-Sayed AK, Hothersall J, Cooper SM, Stephens E, Simpson TJ and Thomas CM, Chem. Biol, 2003, 10, 419–430. [PubMed: 12770824]
- 34. Yanagisawa T and Kawakami M, J. Biol. Chem, 2003, 278, 25887–25894. [PubMed: 12672810]
- Fukuda D, Haines AS, Song Z, Murphy AC, Hothersall J, Stephens ER, Gurney R, Cox RJ, Crosby J, Willis CL, Simpson TJ and Thomas CM, PLoS One, 2011, 6, e18031. [PubMed: 21483852]
- 36. Cochrane RVK, Sanichar R, Lambkin GR, Reiz B, Xu W, Tang Y and Vederas JC, Angew. Chem. Int. Ed. Engl, 2016, 128, 674–678.
- Olano C, Wilkinson B, Sánchez C, Moss SJ, Sheridan R, Math V, Weston AJ, Braña AF, Martin CJ, Oliynyk M, Méndez C, Leadlay PF and Salas JA, Chem. Biol, 2004, 11, 87–97. [PubMed: 15112998]
- Zeng Y, Kulkarni A, Yang Z, Patil PB, Zhou W, Chi X, Van Lanen S and Chen S, ACS Chem. Biol, 2012, 7, 1565–1575. [PubMed: 22704654]
- 39. Du Y-L, Alkhalaf LM and Ryan KS, Proc. Natl. Acad. Sci, 2015, 112, 2717–2722. [PubMed: 25730866]
- 40. Slater SC, Goldman BS, Goodner B, Setubal JC, Farrand SK, Nester EW, Burr TJ, Banta L, Dickerman AW, Paulsen I, Otten L, Suen G, Welch R, Almeida NF, Arnold F, Burton OT, Du Z, Ewing A, Godsy E, Heisel S, Houmiel KL, Jhaveri J, Lu J, Miller NM, Norton S, Chen Q, Phoolcharoen W, Ohlin V, Ondrusek D, Pride N, Stricklin SL, Sun J, Wheeler C, Wilson L, Zhu H and Wood DW, J. Bacteriol, 2009, 191, 2501–2511. [PubMed: 19251847]
- 41. Kim J-G, Park BK, Kim S-U, Choi D, Nahm BH, Moon JS, Reader JS, Farrand SK and Hwang I, Proc. Natl. Acad. Sci, 2006, 103, 8846–8851. [PubMed: 16731618]

- 42. Harms JM, Wilson DN, Schluenzen F, Connell SR, Stachelhaus T, Zaborowska Z, Spahn CMT and Fucini P, Mol. Cell, 2008, 30, 26–38. [PubMed: 18406324]
- Wieland Brown LC, Acker MG, Clardy J, Walsh CT and Fischbach MA, Proc. Natl. Acad. Sci, 2009, 106, 2549–2553. [PubMed: 19196969]
- 44. Reusser F, Biochemistry, 1973, 12, 4524–4528. [PubMed: 4584327]
- 45. Kim C-G, Lamichhane J, Song K-I, Nguyen VD, Kim D-H, Jeong T-S, Kang S-H, Kim K-W, Maharjan J, Hong Y-S, Kang JS, Yoo J-C, Lee J-J, Oh T-J, Liou K and Sohng JK, Arch. Microbiol, 2008, 189, 463–473. [PubMed: 18080113]
- 46. Hudson GA, Zhang Z, Tietz JI, Mitchell DA and van der Donk WA, J. Am. Chem. Soc, 2015, 137, 16012–16015. [PubMed: 26675417]
- 47. Tocchetti A, Maffioli S, Iorio M, Alt S, Mazzei E, Brunati C, Sosio M and Donadio S, Chem. Biol, 2013, 20, 1067–1077. [PubMed: 23932526]
- 48. Towbin H, Bair KW, DeCaprio JA, Eck MJ, Kim S, Kinder FR, Morollo A, Mueller DR, Schindler P, Song HK, van Oostrum J, Versace RW, Voshol H, Wood J, Zabludoff S and Phillips PE, J. Biol. Chem, 2003, 278, 52964–52971. [PubMed: 14534293]
- 49. Wenzel SC, Hoffmann H, Zhang J, Debussche L, Haag-Richter S, Kurz M, Nardi F, Lukat P, Kochems I, Tietgen H, Schummer D, Nicolas J-P, Calvet L, Czepczor V, Vrignaud P, Mühlenweg A, Pelzer S, Müller R and Brönstrup M, Angew. Chem. Int. Ed, 2015, 54, 15560–15564.
- 50. Lin H-C, Chooi Y-H, Dhingra S, Xu W, Calvo AM and Tang Y, J. Am. Chem. Soc, 2013, 135, 4616–4619. [PubMed: 23488861]
- Feling RH, Buchanan GO, Mincer TJ, Kauffman CA, Jensen PR and Fenical W, Angew. Chem. Int. Ed, 2003, 42, 355–357.
- 52. Kale AJ, McGlinchey RP, Lechner A and Moore BS, ACS Chem. Biol, 2011, 6, 1257–1264. [PubMed: 21882868]
- Schorn M, Zettler J, Noel JP, Dorrestein PC, Moore BS and Kaysser L, ACS Chem. Biol, 2014, 9, 301–309. [PubMed: 24168704]
- 54. Kim KB and Crews CM, Nat. Prod. Rep, 2013, 30, 600-604. [PubMed: 23575525]
- 55. Freiberg C, Brunner NA, Schiffer G, Lampe T, Pohlmann J, Brands M, Raabe M, Häbich D and Ziegelbauer K, J. Biol. Chem, 2004, 279, 26066–26073. [PubMed: 15066985]
- 56. Jin M, Fischbach MA and Clardy J, J. Am. Chem. Soc, 2006, 128, 10660–10661. [PubMed: 16910643]
- 57. Liu X, Fortin PD and Walsh CT, Proc. Natl. Acad. Sci, 2008, 105, 13321–13326. [PubMed: 18768797]
- 58. Wang J, Soisson SM, Young K, Shoop W, Kodali S, Galgoci A, Painter R, Parthasarathy G, Tang YS, Cummings R, Ha S, Dorso K, Motyl M, Jayasuriya H, Ondeyka J, Herath K, Zhang C, Hernandez L, Allocco J, Basilio Á, Tormo JR, Genilloud O, Vicente F, Pelaez F, Colwell L, Lee SH, Michael B, Felcetto T, Gill C, Silver LL, Hermes JD, Bartizal K, Barrett J, Schmatz D, Becker JW, Cully D and Singh SB, Nature, 2006, 441, 358–361. [PubMed: 16710421]
- Wang J, Kodali S, Lee SH, Galgoci A, Painter R, Dorso K, Racine F, Motyl M, Hernandez L, Tinney E, Colletti SL, Herath K, Cummings R, Salazar O, González I, Basilio A, Vicente F, Genilloud O, Pelaez F, Jayasuriya H, Young K, Cully DF and Singh SB, Proc. Natl. Acad. Sci, 2007, 104, 7612–7616. [PubMed: 17456595]
- 60. Smanski MJ, Yu Z, Casper J, Lin S, Peterson RM, Chen Y, Wendt-Pienkowski E, Rajski SR and Shen B, Proceedings of the National Academy of Sciences, 2011, 108, 13498–13503.
- Peterson Ryan M., Huang T, Rudolf Jeffrey D., Smanski Michael J. and Shen B, Chem. Biol, 2014, 21, 389–397. [PubMed: 24560608]
- 62. Mattheus W, Masschelein J, Gao L-J, Herdewijn P, Landuyt B, Volckaert G and Lavigne R, Chem. Biol, 2010, 17, 1067–1071. [PubMed: 21035728]
- Sheehan DJ, Hitchcock CA and Sibley CM, Clin. Microbiol. Rev, 1999, 12, 40–79. [PubMed: 9880474]
- 64. Charlton-Menys V and Durrington PN, Exp. Physiol, 2008, 93, 27-42. [PubMed: 18165431]
- 65. Stancu C and Sima A, J. Cell. Mol. Med, 2001, 5, 378–387. [PubMed: 12067471]

- 66. Chamilos G, Lewis RE and Kontoyiannis DP, Antimicrob. Agents Chemother, 2006, 50, 96–103. [PubMed: 16377673]
- 67. Hutchinson CR, Kennedy J, Park C, Kendrew S, Auclair K and Vederas J, Antonie van Leeuwenhoek, 2000, 78, 287–295. [PubMed: 11386351]
- Bergstrom JD, Kurtz MM, Rew DJ, Amend AM, Karkas JD, Bostedor RG, Bansal VS, Dufresne C, VanMiddlesworth FL and Hensens OD, Proc. Natl. Acad. Sci, 1993, 90, 80–84. [PubMed: 8419946]
- 69. Liu N, Hung Y-S, Gao S-S, Hang L, Zou Y, Chooi Y-H and Tang Y, Org. Lett, 2017, 19, 3560– 3563. [PubMed: 28605916]
- 70. Bonsch B, Belt V, Bartel C, Duensing N, Koziol M, Lazarus CM, Bailey AM, Simpson TJ and Cox RJ, Chem. Comm, 2016, 52, 6777–6780. [PubMed: 27056201]
- 71. Cane DE and Sohng J-K, Biochemistry, 1994, 33, 6524–6530. [PubMed: 8204587]
- 72. Kato M, Sakai K and Endo A, Biochim. Biophys. Acta 1992, 1120, 113-116. [PubMed: 1554737]
- Tetzlaff CN, You Z, Cane DE, Takamatsu S, Omura S and Ikeda H, Biochemistry, 2006, 45, 6179– 6186. [PubMed: 16681390]
- 74. Shinohara Y, Nishimura I and Koyama Y, Biosci. Biotechnol. Biochem, 2018, DOI: 10.1080/09168451.2018.1549934, 1–8.
- van Raaij MJ, Abrahams JP, Leslie AG and Walker JE, Proc. Natl. Acad. Sci, 1996, 93, 6913– 6917. [PubMed: 8692918]
- 76. Mao X-M, Zhan Z-J, Grayson MN, Tang M-C, Xu W, Li Y-Q, Yin W-B, Lin H-C, Chooi Y-H, Houk KN and Tang Y, J. Am. Chem. Soc, 2015, 137, 11904–11907. [PubMed: 26340065]
- 77. Gause EM, Buck MA and Douglas MG, J. Biol. Chem, 1981, 256, 557–559. [PubMed: 6450205]
- 78. Lin T-S, Chiang Y-M and Wang CCC, Org. Lett, 2016, 18, 1366–1369. [PubMed: 26954888]
- Langley DB, Templeton MD, Fields BA, Mitchell RE and Collyer CA, J. Biol. Chem, 2000, 275, 20012–20019. [PubMed: 10747936]
- 80. Mitchell RE and Bieleski RL, Plant Physiol, 1977, 60, 723-729. [PubMed: 16660172]
- Staskawicz BJ, Panopoulos NJ and Hoogenraad NJ, J. Bacteriol, 1980, 142, 720–723. [PubMed: 7380807]
- Aguilera S, López-López K, Nieto Y, Garcidueñas-Piña R, Hernández-Guzmán G, Hernández-Flores JL, Murillo J and Alvarez-Morales A, J. Bacteriol, 2007, 189, 2834–2843. [PubMed: 17237165]
- 83. Bentley R, Chem. Rev, 2000, 100, 3801–3826. [PubMed: 11749328]
- Regueira TB, Kildegaard KR, Hansen BG, Mortensen UH, Hertweck C and Nielsen J, Appl. Environ. Microbiol, 2011, 77, 3035–3043. [PubMed: 21398490]
- 85. Daoust DR, Onishi HR, Wallick H, Hendlin D and Stapley EO, Antimicrob. Agents Chemother, 1973, 3, 254–261. [PubMed: 4790591]
- 86. Coque JJ, Liras P and Martín JF, EMBO J, 1993, 12, 631–639. [PubMed: 8440253]
- 87. Birch AJ and Hussain SF, J. Chem. Soc. C, 1969, DOI: 10.1039/j39690001473, 1473-1474.
- Liu S, Widom J, Kemp CW, Crews CM and Clardy J, Science, 1998, 282, 1324–1327. [PubMed: 9812898]
- 89. Lin H-C, Tsunematsu Y, Dhingra S, Xu W, Fukutomi M, Chooi Y-H, Cane DE, Calvo AM, Watanabe K and Tang Y, J. Am. Chem. Soc, 2014, 136, 4426–4436. [PubMed: 24568283]
- Wiemann P, Guo C-J, Palmer JM, Sekonyela R, Wang CCC and Keller NP, Proc. Natl. Acad. Sci, 2013, 110, 17065–17070. [PubMed: 24082142]
- 91. Toyohara M, Annales de l'Institut Pasteur. Microbiology, 1987, 138, 737–744. [PubMed: 3135829]
- 92. Hoagland DT, Liu J, Lee RB and Lee RE, Adv. Drug Deliv. Rev, 2016, 102, 55–72. [PubMed: 27151308]
- 93. Kling A, Lukat P, Almeida DV, Bauer A, Fontaine E, Sordello S, Zaburannyi N, Herrmann J, Wenzel SC, König C, Ammerman NC, Barrio MB, Borchers K, Bordon-Pallier F, Brönstrup M, Courtemanche G, Gerlitz M, Geslin M, Hammann P, Heinz DW, Hoffmann H, Klieber S, Kohlmann M, Kurz M, Lair C, Matter H, Nuermberger E, Tyagi S, Fraisse L, Grosset JH, Lagrange S and Müller R, Science, 2015, 348, 1106–1112. [PubMed: 26045430]

- 94. Alanjary M, Kronmiller B, Adamek M, Blin K, Weber T, Huson D, Philmus B and Ziemert N, Nucleic Acids Res, 2017, 45, W42–W48. [PubMed: 28472505]
- 95. de los Santos ELC and Challis GL, bioRxiv, 2017, DOI: 10.1101/119214, 119214.
- Kjærbølling I, Vesth T and Andersen MR, mSystems, 2019, 4, e00085–00019. [PubMed: 31098395]
- 97. Tang X, Li J, Millán-Aguiñaga N, Zhang JJ, O'Neill EC, Ugalde JA, Jensen PR, Mantovani SM and Moore BS, ACS Chem. Biol, 2015, 10, 2841–2849. [PubMed: 26458099]
- Price AC, Choi K-H, Heath RJ, Li Z, White SW and Rock CO, J. Biol. Chem, 2001, 276, 6551– 6559. [PubMed: 11050088]
- 99. Li J, Tang X, Awakawa T and Moore BS, Angew. Chem. Int. Ed, 2017, 56, 12234-12239.
- 100. Yeh H-H, Ahuja M, Chiang Y-M, Oakley CE, Moore S, Yoon O, Hajovsky H, Bok J-W, Keller NP, Wang CCC and Oakley BR, ACS Chem. Biol, 2016, 11, 2275–2284. [PubMed: 27294372]
- 101. Lin G, Li D, Chidawanyika T, Nathan C and Li H, Arch. Biochem. Biophys, 2010, 501, 214–220. [PubMed: 20558127]
- 102. Panter F, Krug D, Baumann S and Müller R, Chem. Sci, 2018, 9, 4898–4908. [PubMed: 29910943]
- 103. Yan Y, Liu Q, Zang X, Yuan S, Bat-Erdene U, Nguyen C, Gan J, Zhou J, Jacobsen SE and Tang Y, Nature, 2018, 559, 415–418. [PubMed: 29995859]
- 104. Tsuda Y, Kaneda M, Tada A, Nitta K, Yamamoto Y and Iitaka Y, J. Chem. Soc., Chem. Comm, 1978, 0, 160–161.
- 105. Tang M-C, Zou Y, Yee D and Tang Y, AIChE J, 2018, 64, 4182–4186. [PubMed: 31588145]
- 106. Garg RP, Qian XL, Alemany LB, Moran S and Parry RJ, Proc. Natl. Acad. Sci, 2008, 105, 6543– 6547. [PubMed: 18451033]
- 107. Hu Z, Awakawa T, Ma Z and Abe I, Nat. Commun, 2019, 10, 184. [PubMed: 30643149]





Workflow of NP discovery. (a) activity-guided NP discovery approach. (b) genome-driven NP discovery approach.







Example NP DNA replication inhibitors that employ a mutated target as SRE encoded in biosynthetic gene clusters.



#### Fig. 3.

Example NP protein biosynthesis inhibitors that employ a mutated target as SRE encoded in biosynthetic gene clusters.



#### Fig. 4.

Example NP metabolic enzyme inhibitors that employ a mutated target as SRE encoded in biosynthetic gene clusters.



#### Fig. 5.

NPs discovery inspired by a self-resistance gene. a. Locating the BGC of a NP with known activity. b. Rediscovering the activity of a known NP. c. Discovering NP with desired activity.

#### Table 1.

Example of BGCs containing a self-resistance-gene as a duplicate copy of the housekeeping gene (molecular target)

natural products	organism	molecular target	biosynthetic core gene	SRE verified <sup>a</sup>	FDA approved <sup>b</sup>	SRE inspired <sup>C</sup>
inhibitors of DNA rep	lication					
novobiocin (1)	Streptomyces niveus	bacterial DNA gyrase	NRPS	V	Y	Ν
chlorobiocin (2)	Streptomyces roseochromogenes	bacterial DNA gyrase	NRPS	V	Ν	Ν
coumermycin A1 (3)	Streptomyces rishiriensis	bacterial DNA gyrase	NRPS	V	Ν	Ν
griselimycin (4)	Streptomyces sp. DSM-40835	DnaN	NRPS	V	Ν	Y
inhibitors of protein b	iosynthesis					
mupirocin (5)	Pseudomonas fluorescens	isoleucyl-tRNA synthetase	PKS	V	Y	Ν
thiomarinol A (6)	Pseudoalteromonas sp. SANK 73390	isoleucyl-tRNA synthetase	PKS	V	Ν	Ν
cladosporin (7)	Cladosporium cladosporioides	lysyl-tRNA synthetase	NRPS	V	Y	Ν
borrelidin (8)	Streptomyces parvulus	threonyl-tRNA synthetase	PKS	V	Ν	Ν
albomycin δ2 ( <b>9</b> )	Streptomyces sp. ATCC 700974	seryl-tRNA synthetase	NRPS	V	Ν	Ν
indolmycin (10)	Streptomyces griseus	tryptophanyl-tRNA synthetase	other	Р	Ν	Ν
agrocin 84 (11)	Agrobacterium radiobacter	leucyl-tRNA synthetase	other	V	Ν	Ν
thiocillin (12)	Bacillus cereus	50S ribosomal protein L11	precursor peptide	Р	Ν	Ν
rubradirin (13)	Streptomyces achromogenes	translation initiation factor	PKS	Р	Ν	Ν
GE2270 (14)	Planobispora rosea	elongation factor Tu	precursor peptide	Р	Ν	Ν
thiomuracin (15)	Thermobispora bispora	elongation factor Tu		Р	Ν	Ν
bengamide B (16)	Myxococcus virescens	methionine aminopeptidase, type I	NRPS	V	Ν	Ν
fumagillin (17)	Aspergillus fumigatus	methionine aminopeptidase, type II	PKS	Р	Ν	Ν
inhibitors of protein d	egradation					
salinosporamide A ( <b>18</b> )	Salinispora tropica	proteasome subunit beta	PKS-NRPS hybrid	V	Ν	Ν
eponemycin (19)	Streptomyces hygroscopicus	proteasome subunit beta	NRPS	V	Ν	Ν
fellutamide B (20)	Aspergillus nidulans	proteasome component C5	NRPS	V	Ν	Y
inhibitors of lipid meta	abolism					
andrimid (21)	Pantoea agglomerans	acetyl-CoA carboxylase	NRPS	Р	Ν	Ν

natural products	organism	molecular target	biosynthetic core gene	SRE verified <sup>a</sup>	FDA approved <sup>b</sup>	SRE inspired <sup>C</sup>	
platensimycin (22) / platencin (23)	Streptomyces platensis	FabF	TS	V	Ν	Ν	
kalimantacin (24)	Pseudomonas fluorescens	FabI	PKS	V	Ν	Ν	
lovastatin (25)	Aspergillus terreus	3-hydroxy-3- methylglutaryl-coenzyme A reductase	PKS	V	Y	Ν	
zaragozic acid (26)	Curvularia lunata	squalene synthase	PKS	Р	Ν	Ν	
thiolactomycin (27)	Salinispora pacifica	fatty acid synthase II	PKS	V	Ν	Y	
thiotetroamide C (28)	Streptomyces afghaniensis	fatty acid synthase II	PKS	V	Ν	Y	
inhibitors of carbohyd metabolism	rate and energy						
pentalenolactone (29)	Streptomyces avermitilis	glyceraldehyde-3- phosphate dehydrogenase	TS	V	Ν	Ν	
heptelidic acid (30)	Aspergillus oryzae	glyceraldehyde-3- phosphate dehydrogenase	TS	V	Ν	Ν	
aurovertin E (31)	Metarhizium anisopliae	ATP synthase beta chain	PKS	Р	Ν	Ν	
citreoviridin (32)	Aspergillus terreus	ATP synthase beta chain	PKS	Р	Ν	Ν	
inhibitors of amino aci	d metabolism						
phaseolotoxin (33)	Pseudomonas syringae	ornithine carbamoyltransferase	other	V	Ν	Ν	
aspterric acid (34)	Aspergillus terreus	dihydroxy-acid dehydratase	TS	V	Ν	Y	
inhibitors of nucleotide	e metabolism						
mycophenolic acid (35)	Penicillium brevicompactum	inosine-5'- monophosphate dehydrogenase	PKS	V	Y	Y	
inhibitors of xenobiotic	inhibitors of xenobiotics biodegradation						
cephamycin C (36)	Streptomyces clavuligerus	beta-lactamase	NRPS	Р	Ν	Ν	

<sup>a</sup>verified (V) or proposed (P).

<sup>b</sup>approved (A) or not (N).

 $^{C}$ discovery is SRE inspired (Y) or not (N).