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Diclofenac Identified as a Kynurenine 3-Monoxygenase Binder and Inhibitor by Molecular Similarity Techniques

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Supporting Information

ABSTRACT: In this study, we apply a battery of molecular similarity techniques to known inhibitors of kynurenine 3-monoxygenase (KMO), querying each against a repository of approved, experimental, nutraceutical, and illicit drugs. Four compounds are assayed against KMO. Subsequently, diclofenac (also known by the trade names Voltaren, Voltarol, Aclonac, and Catallam) has been confirmed as a human KMO protein binder and inhibitor in cell lysate with low micromolar 

Kynurenine 3-monooxygenase (KMO) is a nicotinamide adenine dinucleotide phosphate (NADPH)-dependent flavoprotein hydroxylase that catalyzes the hydroxylation of kynurenine (Kyn) to generate cytotoxic 3-hydroxykynurenine (3-HK). KMO has been identified as an important therapeutic target in systemic inflammation triggered by acute pancreatitis and in Huntington’s disease. KMO is a key regulator of metabolic flux through the kynurenine pathway of tryptophan metabolism, the main route of tryptophan metabolism in mammals. Perturbations in KMO activity, using genetically altered mice deficient in KMO and by specific inhibitors, generate biologically important alterations in plasma and tissue concentrations of several neuroactive and immunoregulatory metabolites. KMO is found in high concentrations in the liver and kidney and is also expressed by macrophages and microglia cells. The protein is localized on the mitochondrial outer membrane and contains a stretch of hydrophobic amino acids at its C terminus, which is believed to be the mitochondrial membrane-anchoring domain. This transmembrane domain is thought to account for the solubility difficulties encountered during the recombinant protein production of the human enzyme. The crystal structure of human KMO remains as-yet unsolved in the public domain. Crystallization of membrane proteins is particularly challenging because of the need for high yields of correctly folded, homogeneous, stable protein. Importantly, detergent is commonly required for the solubility and stability of membrane proteins but is often detrimental to the success of crystallization attempts. Approaches to tackle human KMO inhibition using a Pseudomonas fluorescens KMO crystal structure have been successful, resulting in the exploration of active compound series and progression to a clinical candidate. In our study, we took a ligand-based approach, applying molecular similarity techniques to rank approved and experimental drugs in similarity to known KMO inhibitors.

INTRODUCTION

Increasing costs and attrition rates associated with bringing a new drug to market have driven interest in repurposing existing drugs for new indications. Routine use of drugs for new drug to market have driven interest in repurposing existing, typically approved for use in adults being prescribed by physicians for use in children. With the ability to use existing, approved drugs “off-label”, the application of molecular similarity techniques offers an extremely attractive route toward treating disease states, identifying approved drugs capable of making similar interactions to known ligands of target proteins.

Kynurenine 3-monoxygenase (KMO) is a nicotinamide adenine dinucleotide phosphate (NADPH)-dependent flavoprotein hydroxylase that catalyzes the hydroxylation of kynurenine (L-Kyn) to generate cytotoxic 3-hydroxykynurenine (3-HK). KMO has been identified as an important therapeutic target in systemic inflammation triggered by acute pancreatitis and in Huntington’s disease. KMO is a key regulator of metabolic flux through the kynurenine pathway of tryptophan metabolism, the main route of tryptophan metabolism in mammals. Perturbations in KMO activity, using genetically altered mice deficient in KMO and by specific inhibitors, generate biologically important alterations in plasma and tissue concentrations of several neuroactive and immunoregulatory metabolites. KMO is found in high concentrations in the liver and kidney and is also expressed by macrophages and microglia cells. The protein is localized on the mitochondrial outer membrane and contains a stretch of hydrophobic amino acids at its C terminus, which is believed to be the mitochondrial membrane-anchoring domain. This transmembrane domain is thought to account for the solubility difficulties encountered during the recombinant protein production of the human enzyme. The crystal structure of human KMO remains as-yet unsolved in the public domain. Crystallization of membrane proteins is particularly challenging because of the need for high yields of correctly folded, homogeneous, stable protein. Importantly, detergent is commonly required for the solubility and stability of membrane proteins but is often detrimental to the success of crystallization attempts. Approaches to tackle human KMO inhibition using a Pseudomonas fluorescens KMO crystal structure have been successful, resulting in the exploration of active compound series and progression to a clinical candidate. In our study, we took a ligand-based approach, applying molecular similarity techniques to rank approved and experimental drugs in similarity to known KMO inhibitors.

RESULTS AND DISCUSSION

Ten small molecules known to be KMO inhibitors with nanomolar- to low-micromolar-range half-maximal inhibitory concentrations (IC₅₀) (Supporting Information Table S1) were selected as input to molecular similarity techniques (see Experimental Section). Small-molecule similars were extracted from the DrugBank database. Nine of the actives were deemed too dissimilar to anything in DrugBank to follow up experimentally. One active compound, termed “Pharmacia

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WO199805660 core scaffold displayed a high degree of similarity to seven small molecules within DrugBank (Supporting Information Table S2). Patent literature documents derivatives of the Pharmacia WO199805660 core scaffold as having IC_{50} of less than 100 μM against *Rattus norvegicus* KMO. Substructure searching of the ChEMBL database (version 23) revealed a series of 16 derivatives that have activities on eight kinases based on an IC_{50} value cutoff of 10 μM (see Supporting Information Table S3). However, no targets for the unmodified Pharmacia WO199805660 core scaffold are reported in ChEMBL. We were able to purchase only four (Figure 1) of the seven priority molecules: quinaldic acid, dipicolinic acid, sulfapyridine, and diclofenac. Quinaldic acid is a product of L-Kyn catabolism via the kynurenic acid side arm of the kynurenine pathway. Dipicolinic acid composes 5–15% of bacterial spores by weight and has been proposed as a key component in their heat stress pathways. Sulfapyridine, an antibacterial classically used to treat pneumonia and widely prescribed because of the problems with crystallization in the bladder, is now no longer widely used during the Second World War, is now no longer widely used.

**Figure 1.** Molecular similarity to the Pharmacia WO199805660 core scaffold led to four compounds being sourced for testing. Only diclofenac was identified as an active inhibitor of KMO.

After the confirmation of diclofenac as a binder and inhibitor of KMO, five *Saccharomyces cerevisiae* KMO crystal structures were published by Amaral et al. Of key interest to the evaluation of diclofenac as a KMO inhibitor are two of these structures: first, PDB ID 4J36 containing KMO, a flavin–adenine dinucleotide (FAD) molecule, and a small-molecule inhibitor and second UPF 648, a 2-(3,4-dichlorobenzoyl)-cyclopropanecarboxylic acid, displaying a K_{i} of 74 ± 14 nM against yeast KMO and 56.7 ± 6.8 nM against human KMO.

Another structure with PDB ID 4J33 contains *S. cerevisiae* KMO bound to only the FAD molecule, allowing a valuable comparison of conformational changes upon inhibitor binding. Amaral et al. suggest, through the use of model building, that UPF 648 acts as a mimic of L-Kyn, binding into the same pocket, blocking L-Kyn turnover via NADPH into 3-HK. However, UPF 648 is larger than L-Kyn, with a molecular weight of 259 versus 208, and has a significantly more hydrophobic bulk (clog P values of 2.27 and −1.3, respectively). This is structurally accounted for by loop movement (Pro321–Gln325) and reorientation of a six-stranded antiparallel β-sheet. Amaral asserts the validity for the use of *S. cerevisiae* KMO as a template for a structure-based drug design against human KMO. In addition, the nonhuman structure of *P. fluorescens* KMO has been used to develop compounds with nanomolar IC_{50} as well as a clinical candidate. Visual overlays of UPF 648 and diclofenac show a striking similarity, suggesting a common binding mode. Indeed, docking of diclofenac into the *S. cerevisiae* KMO structure with PDB ID 4J36 using Autodock Vina 1.1.2 (see Figure 3 and Supporting Information for docking protocol) reveals a plausible binding mode.

**Figure 2.** Plot showing the inhibition of KMO by diclofenac in whole cells and in the cell lysate-based assays.

<table>
<thead>
<tr>
<th>assay</th>
<th>protein source</th>
<th>protein/assay</th>
<th>parameter</th>
<th>value</th>
</tr>
</thead>
<tbody>
<tr>
<td>kinetic</td>
<td>HEK-KMO cell lysate</td>
<td>200 μg of total protein</td>
<td>IC_{50}</td>
<td>13.6 μM</td>
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<tr>
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<td>HEK-KMO whole cells</td>
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<td>10 μM KMO protein</td>
<td>K_{D}</td>
<td>64.8 μM</td>
</tr>
</tbody>
</table>

**Figure 3.** *Saccharomyces cerevisiae* KMO (green) from the structure with PDB ID 4J36 in the complex with the FAD cofactor (magenta) and UPF 648 (blue). Predicted binding mode of diclofenac (cyan) is shown in the overlay.
CONCLUSION

In conclusion, we have successfully applied molecular similarity methods to identify diclofenac, an approved and widely used drug, as capable of binding to, and inhibiting, human KMO with a limited low micromolar affinity and activity in vitro and in cell lysate. Because of the difficulty in purifying full-length human KMO, the binding affinity is possibly underestimated and might be closer to the lysate-derived IC₅₀ value, with both results representing good estimates. The considerable potency reduction of ~1 log step of diclofenac in cells is likely due to the impaired cellular permeability associated with the carboxylic acid moiety. Additionally, diclofenac is known to bind to and inhibit many extra- and intracellular targets. Interestingly, none of the eight kinases reported as targets for the Pharmacore core scaffold are shared with diclofenac. The ChEMBL database (version 2.3) reports single-digit nanomolar IC₅₀/Kᵦ₅ for three protein targets—cyclooxygenase 1 and 2 and the interleukin-8 receptor A. See Supporting Information Table S4 for ChEMBL-assigned targets of diclofenac. Depending on the abundance and affinities of the high number of known targets for diclofenac, the effective concentration exposed to intracellular KMO may be greatly reduced. It is important to emphasize that the presented results only highlight a starting point for a possible drug repurposing process. However, the data serve to highlight the power of molecular similarity techniques and their value in the discovery of medicinal chemistry starting points and the prediction of off-target effects. Intensive work combining structural biology and several rounds of medicinal chemistry would be needed to identify a diclofenac derivative with nanomolar activity to reach a lead compound status for KMO.

EXPERIMENTAL SECTION

Molecular Similarity. A survey of literature followed by visual inspection and clustering identified 10 potent KMO inhibitors (Supporting Information Table S1) that had their predicted lowest energy three-dimensional (3D) conformation generated using Omega229 (OpenEye Scientific, version 2.3.2) and written out in the SD file format. A data set containing approved, experimental, nutraceutical, illicit, and withdrawn drugs was obtained from the DrugBank31 Web service (data downloaded on 30/6/2010), and the same 3D conformer generation procedure was applied with the addition of a salt-stripping step using OpenBabel32 (version 2.2.2), generating 4648 low-energy conformers. Programs implementing MACCS, Path, and LINGO fingerprints were implemented in the Java programming language using the Chemistry Development Kit.33 C++ programs were written making use of the OpenBabel API34 to generate FP2, FP3, and FP4 fingerprints. Implementations of USR35 and USF RAT36 were also written in C++. Tanimoto distances38 were used to score molecules by fingerprint-based methods (FP2, FP3, FP4, Path, LINGO, and MACCS). A simple Euclidean distance was used for USR and USFRAT similarity comparison scoring. Each of the 10 known KMO inhibitors was then scored against each of the 4648 drug data set using each of the 8 measures of molecular similarity, resulting in a total of 371 840 similarity comparisons (see Supporting Information spreadsheet). Each similarity method run on a known inhibitor was then sorted in the order of descending level of calculated similarity. See Supporting Information for full results. Manual inspection of results revealed that only the USFRAT similarity method applied to the Pharmacia WO199805660 core scaffold gave rise to convincing similars. Seven of these similars were prioritized, but only four were available for purchase and subsequent assay.

Cloning of full-length human KMO (KMO (V5-6His) construct), expression of this construct in HEK293 cells, and analysis of KMO enzymatic activity using liquid chromatography–mass spectrometry (LC–MS) were performed, as described by us previously.10

Compound IC₅₀ Determination in the KMO Lysate. To determine the IC₅₀ of compounds against human KMO enzyme in the cell lysate,10 the compounds were incubated in duplicate at the following concentrations: 200, 100, 50, 20, 10, 1, 0.5, 0.2, and 0.1 μM. The low control for this assay consisted of 200 μg of cell lysate (total protein) in the absence of an inhibitor, whereas high controls were enzyme-free. IC₅₀ data were plotted using the GraFit v5.0.1 software (Erithacus Software Limited). The standard IC₅₀ equation in GraFit, \( y = \frac{100}{1 + e^{-s(x-x_0)}} \), was used to fit the data to obtain IC₅₀ and the Hill slope value s. Input parameters were percentage of inhibition (y) and logarithm of compound concentration (x).

Cellular Compound IC₅₀ Determination. The IC₅₀ values of compounds were tested in the cellular context to determine the cell permeability of test compounds. HEK293-KMO(V5-6His) cells were passaged in 96-well plates at 2 × 10⁴ cells per well in Dulbecco’s modified Eagle’s medium with 10% fetal bovine serum, 1% l-glutamine, and 1% penicillin–streptomycin. The cell lysate samples were incubated overnight at 37 °C in 5% CO₂/95% O₂. The assay medium utilized was Opti-MEM containing 1% l-glutamine, 1% penicillin–streptomycin, and 200 μM L-Kyn. The compounds for testing were diluted in this medium with a final dimethyl sulfoxide (DMSO) concentration of 1%. 3-HK was diluted in the assay medium in the absence of L-Kyn to produce a standard curve with the following concentrations: 200, 100, 50, 20, 10, 1, 0.5, 0.2, and 0.1 μM. Low controls consisted of opti-MEM with 1% l-glutamine, 1% penicillin–streptomycin, 200 μM L-Kyn, and 1% DMSO, whereas high controls consisted of the same buffer minus L-Kyn. The standards, compounds, and control dilutions were added to the cells over 20 h at 37 °C in 5% CO₂/95% O₂. Following incubation, the assay samples (i.e., cellular supernatants) were transferred to a 96-well masterblock before the addition of 500 μL of acetonitrile containing 25 μg/mL d5-tryptophan per well to terminate activity. This solution was dried under nitrogen, and each sample was solubilized by the addition of 100 μL of 30:70 methanol/water with 0.1% formic acid. The samples were transferred to 96-well v-bottom plates for MS analysis. (MS analysis was performed as described above.)

Microdialysis. Microdialysis was used to assess the direct binding affinity, expressed as dissociation constant, Kᵦ₀, of diclofenac for KMO in a method similar to that reported by Weidemann et al.27 KMO (expressed as above) was enriched from HEK293 cells overlaid with dialysis chamber of the RED device insert. The compound was placed in the wells of a compatible base plate (Piece, Thermo Scientific). The enriched KMO target protein was diluted to a concentration of 10 μM in the assay buffer [20 mM 4-(2-hydroxyethyl)-1-piperazineethanesulfonic acid pH 7.0] in a total volume of 100 μL and added to the sample chamber of the RED device insert. Assay buffer (300 μL) was added to the dialysis chamber of the RED device insert. The compound was added to the starter volume of the sample chamber at a final concentration of 20 μM. Controls consisted of compounds at...
the same concentration in the assay buffer in the absence of the enzyme. The plate was covered with a sealing tape and incubated for 6 h at 37 °C with rotation at 100 rpm. Samples of 50 μL were obtained from both the sample and dialysis compartments of the chamber and transferred to LC–MS vials with 10 μL of acetonitrile per sample for MS analysis (see Supporting Information). Kp values were calculated using the data obtained from MS analysis according to the formula determined by Weidemann et al.27 Diclofenac was diluted in the assay buffer at the concentrations of 1, 2, 5, 10, 20, and 50 μM in LC–MS vials to provide a standard curve, allowing quantification of concentrations from the assay samples. The samples were analyzed using the MS method previously described.35

■ ASSOCIATED CONTENT

Supporting Information
The Supporting Information is available free of charge on the ACS Publications website at DOI: 10.1021/acsomega.7b02091.

Molecular similarity results (XLSX)
Known KMO inhibitors used as input to molecular similarity techniques; prioritized drugs for assay; and AutoDock Vina docking protocol and parameters (PDF)

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Notes
The authors declare no competing financial interest.

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■ REFERENCES


