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Published in:

Journal of enzyme inhibition and medicinal chemistry

DOI:

[10.1080/14756366.2016.1201812](https://doi.org/10.1080/14756366.2016.1201812)

IMPORTANT NOTE: You are advised to consult the publisher's version (publisher's PDF) if you wish to cite from it. Please check the document version below.

Document Version

Publisher's PDF, also known as Version of record

Publication date:

2016

[Link to publication in University of Groningen/UMCG research database](#)

Citation for published version (APA):

Masini, T., Birkaya, B., van Dijk, S., Mondal, M., Hekelaar, J., Jager, M., van Scheltinga, A. C. T., Patel, M. S., Hirsch, A. K. H., & Moman, E. (2016). Furoates and thenoates inhibit pyruvate dehydrogenase kinase 2 allosterically by binding to its pyruvate regulatory site. *Journal of enzyme inhibition and medicinal chemistry*, 31 (S4), 170-175. <https://doi.org/10.1080/14756366.2016.1201812>

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To cite this article: Tiziana Masini, Barbara Birkaya, Simon van Dijk, Milon Mondal, Johan Hekelaar, Manuel Jäger, Anke C. Terwisscha van Scheltinga, Mulchand S. Patel, Anna K. H. Hirsch & Edelmiro Moman (2016) Furoates and thenoates inhibit pyruvate dehydrogenase kinase 2 allosterically by binding to its pyruvate regulatory site, *Journal of Enzyme Inhibition and Medicinal Chemistry*, 31:sup4, 170-175, DOI: [10.1080/14756366.2016.1201812](https://doi.org/10.1080/14756366.2016.1201812)

To link to this article: <https://doi.org/10.1080/14756366.2016.1201812>


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RESEARCH ARTICLE

Furoates and thenoates inhibit pyruvate dehydrogenase kinase 2 allosterically by binding to its pyruvate regulatory site

Tiziana Masini¹, Barbara Birkaya², Simon van Dijk¹, Milon Mondal¹, Johan Hekelaar³, Manuel Jäger¹, Anke C. Terwisscha van Scheltinga³, Mulchand S. Patel², Anna K. H. Hirsch¹, and Edelmiro Moman^{4,5}

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Abstract

The last decade has witnessed the reawakening of cancer metabolism as a therapeutic target. In particular, inhibition of pyruvate dehydrogenase kinase (PDK) holds remarkable promise. Dichloroacetic acid (DCA), currently undergoing clinical trials, is a unique PDK inhibitor in which it binds to the allosteric pyruvate site of the enzyme. However, the safety of DCA as a drug is compromised by its neurotoxicity, whereas its usefulness as an investigative tool is limited by the high concentrations required to exert observable effects in cell culture. Herein, we report the identification – by making use of saturation-transfer difference NMR spectroscopy, enzymatic assays and computational methods – of furoate and thenoate derivatives as allosteric pyruvate-site-binding PDK2 inhibitors. This work substantiates the pyruvate regulatory pocket as a druggable target.

Introduction

Metabolic reprogramming is essential for the viability of cells trapped in a pathological state of constitutive growth and proliferation¹. New findings are shedding light on the mechanisms orchestrating such reprogramming and favour a comprehensive paradigm that recognizes an altered metabolism as a core hallmark of cancer^{2,3}. The signalling and metabolic pathways implicated in cancer bioenergetics are thus (re)emerging as promising therapeutic targets⁴.

Cancer cells tend, for instance, to divert glucose towards cytosolic lactic acid production, a phenomenon historically referred to as the Warburg effect⁵. In turn, inhibitors of protein dehydrogenase kinase (PDK), whose isoforms 1 and 3 are upregulated in several cancers⁶, have been shown to reverse this phenomenon, hence hampering tumours from meeting their abnormal metabolic requirements⁷.

PDK is a tightly regulated mitochondrial kinase that inhibits the activity of the pyruvate dehydrogenase complex (PDC) *via* reversible phosphorylation⁸. Several allosteric sites have been identified in its regulatory domain, including the pyruvate-binding pocket, which induces the inactivation of the enzyme as pyruvate concentration raises⁹. Synthetic PDK inhibitors have been discovered for all four binding sites that are large enough to host small organic molecules^{10–16}. However, dichloroacetic acid

Keywords

Cancer metabolism, DCA, dichloroacetate, PDC, PDK2 inhibitors, pyruvate

History

Received 5 March 2016
Revised 30 April 2016
Accepted 7 June 2016
Published online 29 June 2016

(DCA) remained to date the only *bona fide* pyruvate-site PDK synthetic inhibitor^{10–12}.

DCA has already shown significant promise *in vivo*⁸, either alone or in combination therapy¹⁷. However, the limited clinical studies conducted so far remain insufficient to appraise the therapeutic value of the compound¹⁸. Moreover, several reports caution about its potential neurotoxic side effects¹⁹. The usefulness of DCA as an investigative chemical probe for the study of cancer metabolism is also limited as a consequence of the high concentrations (ranging from 17 to 50 mM) required in order to observe a significant effect in cell culture²⁰.

The aim of this study was to determine whether or not the pyruvate regulatory site of PDK is a druggable pocket with a view to develop novel inhibitors with improved therapeutic profiles as compared to DCA. Advantages of targeting the pyruvate pocket include the fact that it is a well-defined and largely hydrophobic pocket¹⁰ and that inhibitors binding to this site are noncompetitive⁷.

Materials and methods

Starting materials and reagents were purchased from Aldrich, Acros, Alfa Aesar or Apollo Scientific. All solvents were reagent-grade and, if necessary, dried and distilled prior to use. All reactions were run under a nitrogen atmosphere unless otherwise stated. Column chromatography was performed using silica gel (Silicycle® SiliaSepTM 40–63 μm). TLC was performed with silica gel 60/Kieselguhr F254. ¹H-NMR and ¹³C-NMR spectra were recorded at 400 MHz on a Varian AMX400 spectrometer (400 MHz for ¹H, 101 Hz for ¹³C) at 25 °C. Chemical shifts (δ) are

reported relative to the residual solvent peak (CD3OD, $^1\text{H} = 3.31$; $^{13}\text{C} = 49.15$. $(\text{CD}_3)_2\text{SO}$, $^1\text{H} = 2.50$; $^{13}\text{C} = 39.52$). Splitting patterns are indicated as (s) singlet and (d) doublet. High-resolution mass spectra were recorded with an LTQ Orbitrap XL (Thermo Fisher Scientific) mass spectrometer, using ESI as ionization source. FT-IR were measured on PerkinElmer FT-IR spectrometer. Melting points (mp) were measured with a Buchi melting point B-545. Some of the compounds were purchased from Sigma (**2**), Maybridge (**4**), Apollo (**5**, **12**, **16**), Acros (**6**, **13**, **14**), and Alfa Aesar (**15**) and used without further purification after confirming their identity and purity by ^1H -NMR. Compounds **7**²¹, **3**²², **17**²³ were prepared according to literature procedures and their spectral data are consistent with the literature. Proof of purity was obtained for all compounds subjected to biochemical assays (>95% purity by HPLC).

Experimental

Model building

In order to fill the missing regions in the template, a model of human PDK2 was built with Modeller 9v2 using the crystal structure 2BU8¹⁰ as a template. ADP, DCA, Mg^{+2} and the coordinated water molecules were kept from the template, whereas a K^+ ion bound to the potassium binding site and one coordinated water molecule were added from 3CRK. The added loops were refined with Modeller. The resulting model, solvated within a water box 14 Å larger than the molecular system dimensions and neutralized with 0.15 M KCl, was relaxed using NAMD by means of an alternate series of energy minimizations and molecular dynamics simulations using periodic boundary conditions (PBC) and the canonical ensemble. First, only the bulk solvent and ions were allowed to relax, next, different parts of the system were consecutively freed in the following order: hydrogen atoms, loops, side chains and, finally, the entire system was relaxed. Initial CHARMM general force field parameters for DCA were derived using the SwissParam server and the initial topology was refined on the basis of PCM/MP2/6-31 + g(d,p) calculations carried out with GAMESS²⁴. The quality of the final and intermediate protein models was evaluated with MolProbity.

Calculation of binding enthalpies

The geometry of all the described ligands was optimized at the PCM/MP2/6-31 + g(d,p) level of theory with GAMESS²⁴. The compounds were docked using AutoDock Vina²⁵ into the pyruvate site of the protein structure model built from 2BU8¹⁰ as described previously. The enthalpies of binding were reevaluated for each complex at the COSMO/PM6-DH+//COSMO/PM6-DH2X level of theory (the full complexes were minimized with PM6-DH+²⁶ and single-point calculations on the minimized structures were then carried out with PM6-DH2X²⁷) using MOPAC2012²⁸. Two alternative poses for each ligand were evaluated. The data reported correspond to that with the most favourable PM6-DH2X binding energy.

Ligand efficiency

Solvent accessible surface areas (ASAs) were computed with ASV²⁹ taking the van der Waals radii from Mantina et al.³⁰

Overexpression and purification of PDC proteins

Recombinant human E1 mutant (the α subunit with only phosphorylation site 1 functional and the serine residues at sites 2 and 3 replaced with alanine³¹) and wild-type human E3³² were overexpressed in *E. coli* BL21 cells, purified using Ni^{2+} -NTA-agarose chromatography and eluted with a linear 50–200 mM

imidazole gradient. The resulting proteins were ~95% pure as judged by SDS-PAGE densitometry. Recombinant human E2-E3BP was co-expressed and purified from BL21 cells harbouring pP-DHE2/E3BP as described by Yang et al.³³ with minor modifications³⁴. Human PDK2 was amplified from cDNA made from HEK293 cells and subcloned into pET-28b. Recombinant human PDK2 was purified from BL21 cells transformed with pET-28b expression vector as described previously^{34,35}.

PDC activity assay

PDK inhibitors were dissolved in DMSO to the concentration of 100 mM. Subsequent dilutions were done with double distilled water. DMSO had no effect on PDC activity. All the inhibitors were investigated for their ability to alter the PDC activity. None of the inhibitors affected PDC activity when used alone or in the presence of PDK2 (without added ATP). The PDC assay took the advantage of PDK-dependent phosphorylation of the α subunit of E1 resulting in the inhibition of PDC activity. Phosphorylation of mutant E1 (the α subunit with only phosphorylation site 1 functional and the serine residues at sites 2 and 3 replaced with alanine) was measured by inactivation of PDC by PDK2³¹. Since there was only one functional phosphorylation site (site 1) in the mutant E1, the rate of its phosphorylation correlated with the rate of PDC inactivation. In the two-step assay, the PDK assay was conducted first with the known PDC activity in the presence of PDK2 causing phosphorylation and hence inactivation of PDC. In the second step, the remaining PDC activity is measured using PDC assay³¹. PDC proteins with final concentrations of: 0.1 mg/mL E1, 0.1 mg/mL E2-E3BP, 0.05 mg/mL dihydrolopoamide dehydrogenase component (E3) and 0.15 mg/mL PDK2 were incubated in a premix (20 mM KH_2PO_4 , pH 7.5, 1 mM MgCl_2 , 0.05 mM EDTA, 1 mM dithiothreitol) for 10 min at 4 °C to allow formation of the PDC complex. Aliquots (10 μL) were taken and 3 μL of 0.25 mM ATP was added to start PDK2 reaction, and after 2 min 10 μL was transferred to PDC assay mixture. PDC activity was measured in 1 mL reaction mixture (50 mM potassium phosphate, pH 7.5, 2 mM MgCl_2 , 1.4 mM NAD^+ , 500 mM thiaminpyrophosphate, 4 mM cysteine and 156 μM coenzyme A). The reaction was started by the addition of pyruvate to a final concentration of 2 mM and the change in absorbance at 340 nm/min was measured to calculate PDC activity³⁴.

Dynamic light scattering

Dynamic light scattering (DynaPro NanoStar; Wyatt) was used to characterize the purified protein sample. The sample (5 mg/mL) was centrifuged for 5 min at 14 000 $\times g$. The analyses showed two molecular weight populations (two peaks). One, 98% of the mass, represents the PDK2 dimer with a polydispersity of ~40% based on the mass. The second peak, ~2% of the mass represents a much larger complex with very high polydispersity such as protein aggregate. Storage for several days on ice in the cold room showed comparable DLS results, indicating that the purified protein sample is stable under these conditions.

STD-NMR binding experiments

All ^1H -STD-NMR experiments were performed at 10 °C on a Varian 600 MHz spectrometer. The on-resonance irradiation on PDK2 was set at -1 ppm. In each experiment, one ligand and PDK2 were present. The final concentrations of ligand and PDK2 were 400 μM and 10 μM , respectively, ([PDK2]:[ligand] = 1:40). First, the ^1H -NMR spectra of ligands in HEPES buffer (20 mM HEPES of pH 8, 100 mM KCl, 10 mM β -mercaptoethanol and 0.1 M EDTA in deuterated water), in presence of protein (off-resonance ^1H NMR spectra) were recorded.

Subsequently, on-resonance $^1\text{H-NMR}$ spectra were recorded with 1000 scans. $^1\text{H-STD-NMR}$ spectra were obtained by subtracting the on-resonance spectrum from the corresponding off-resonance spectrum (Figures S5–S10). $^1\text{H-STD-NMR}$ analysis revealed that all six ligands bind to the protein.

$^1\text{H-STD-NMR}$ competition experiments

To confirm that all the ligands bind to the same pocket of PDK2 as DCA, a competition experiment was performed using **8** (which has the highest activity from all ligands investigated). First, the $^1\text{H-STD-NMR}$ of 400 μM **8** was recorded as mentioned above. Subsequently, 400 μM DCA was added to the same NMR tube and a second $^1\text{H-STD-NMR}$ spectrum was recorded. The second $^1\text{H-STD-NMR}$ spectrum showed the appearance of DCA peaks and disappearance of peaks from **8**, which indicated that **8** was displaced by DCA from the binding pocket of PDK2 (Figure S11). This experiment confirms that both **8** and DCA bind to the same binding pocket of the enzyme.

Results and discussion

By making use of structure-based design and virtual screening techniques, we have identified a number of chemical scaffolds as potential inhibitors of PDK targeting the pyruvate-binding site. Herein, we report our first enzymatic activity results with furoate and thenoate derivatives. Figure 1 displays the structures of the compounds, which were either synthesized or purchased and subjected to biochemical evaluation.

The rationale for privileging such scaffolds at the proof-of-concept phase is two-fold: On the one hand, their structures resemble that of pyruvate but are more versatile in terms of derivatisation; and, on the other hand, furoates are known to be intermediates in the energy metabolism of certain microorganisms³⁶.

Furthermore, in terms of molecular recognition, molecular docking calculations predict furoates and thenoates to bind to the pyruvate site of PDK2 in a pose resembling that observed for DCA in the crystal structure with PDBID 2BU8¹⁰. Figure 2 shows the binding mode of DCA (**2**) within the pyruvate-binding site of PDK2. The predicted binding pose for the most active compound of the series, **8**, is also displayed (balls and sticks). A carboxylate or other negatively charged functional group seems to be fundamental for the initial recognition by gate residues Arg154 and Arg158 (human PDK2 numbering is used, unless otherwise stated), in addition to establishing a hydrogen bond/salt bridge network with Tyr80, Arg154 and, potentially, Arg158. In turn, the aromatic moiety is predicted to establish a π - π -stacking interaction with the side chain of His115. Furthermore, the methyl

substituent allows this compound to maintain additional van der Waals interactions with Leu49 and Ile87.

The inhibitory activity of the reported compounds was determined indirectly by means of the PDC assay³¹. PDC activity is regulated by phosphorylation/dephosphorylation of the α subunit of the pyruvate dehydrogenase component (E1) on three specific serine residues: SER264 (site 1), SER271 (site2) and SER203 (site 2). PDK2 inhibits PDC by phosphorylating sites 1 and 2, but not 3³⁴. In order to observe a more linear effect between E1 α phosphorylation and PDC inactivation, and provided that PDK2 presents the highest affinity towards site 1, sites 2 and 3 were mutated to alanine³¹.

PDC activity was evaluated, respectively, in the absence of both PDK2 and the inhibitors; in the presence of each of the inhibitors but without PDK2 (this permitted us to exclude a direct effect of our compounds on PDC activity); in the presence of fully-active PDK2 with no inhibitor; and, finally, in the presence of both PDK2 and each of the inhibitors at concentrations ranging from 1 μM to 1 mM. The results are summarized in Table 1 and represent the percentage of restoration of PDC activity in the presence of the inhibitor, thus $[100 \times (A_{\text{PDC} + \text{PDK2} + \text{Inhibitor}} - A_{\text{PDC} + \text{PDK2}}) / (A_{\text{PDC}} - A_{\text{PDC} + \text{PDK2}})]$, where A_{PDC} is the activity of PDC alone, $A_{\text{PDC} + \text{PDK2}}$ is the activity of PDC in the presence of PDK2, and $A_{\text{PDC} + \text{PDK2} + \text{Inhibitor}}$ is the activity of PDC in the presence of both PDK2 and the respective inhibitor at a given concentration.

As it can be seen in Table 1, DCA (**2**) is the most active compound, being able to restore, through PDK2 inhibition, 50% of PDC activity at 0.01 mM and 100% at 0.1 mM. Our most active compound in these series is thenoate **8**, which restored 75% of PDC activity at 0.1 mM. In turn, compounds **4**, **11**, **12** and **15** were able to restore 50% of the basal activity at 0.1 mM and 100% at 1 mM. Finally, compound **5** restored complete PDC activity at 1 mM but showed no inhibitory activity at lower concentrations. None of the thenoates and furoates showed any sizeable inhibitory activity at 0.01 mM.

^1H Saturation-transfer difference NMR ($^1\text{H-STD-NMR}$) experiments confirmed that **2**, **4**, **5**, **8**, **11** and **12** bind directly to PDK2. In addition, we employed $^1\text{H-STD-NMR}$ spectroscopy to carry out competition assays between DCA (**2**) and **8**, which revealed that DCA displaces **8** from the binding site of the enzyme. This experiment demonstrated that both DCA and **8** bind to the same pocket of the enzyme. Given that DCA is a *bona fide* pyruvate-site inhibitor^{10–12}, we conclude that, as predicted by the computational studies, **8** exerts its inhibitory action by binding to the allosteric pyruvate regulatory site of the enzyme.

In terms of structure–activity relationships (SARs), it is noteworthy that four (**4**, **11**, **12** and **15**) out of the five most

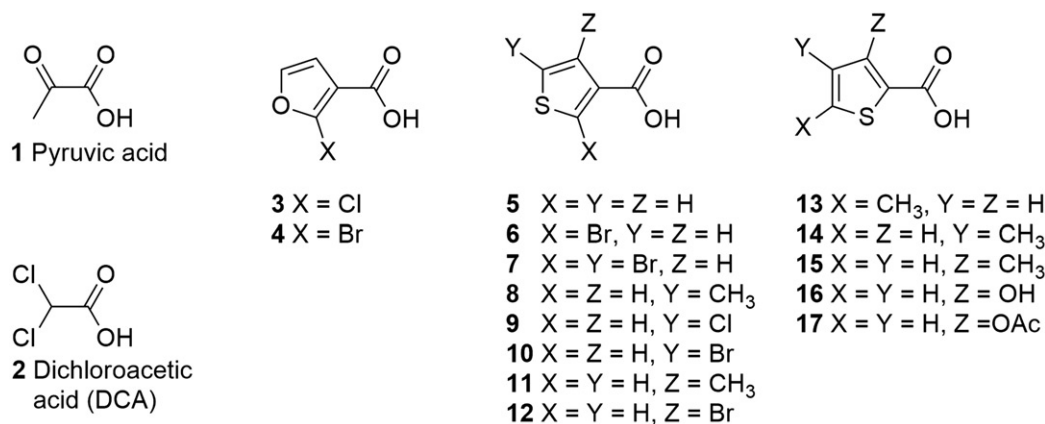


Figure 1. Structures of pyruvic acid (**1**) and the tested compounds.

Figure 2. Predicted binding mode of compound **8** (balls and sticks) superimposed with the PDK2/DCA co-crystal structure 2BU8 (sticks).

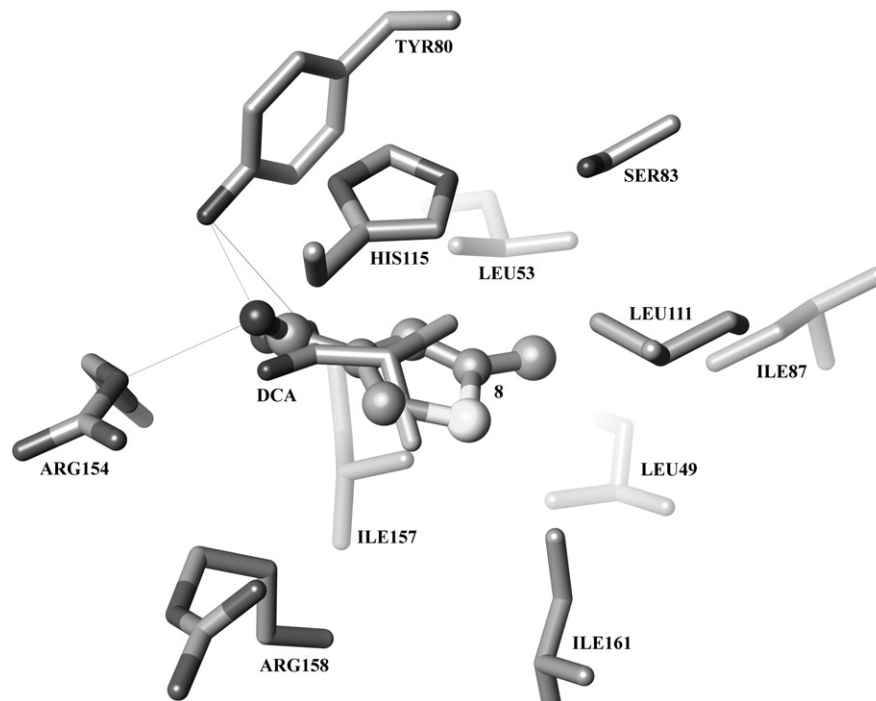


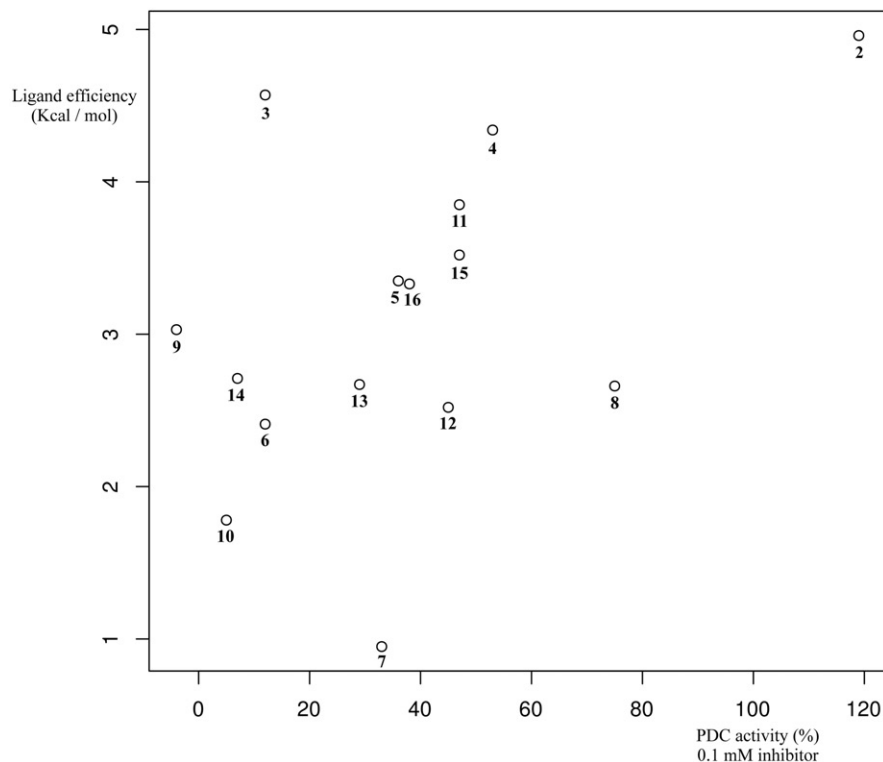
Table 1. Percentage restoration of PDC activity at different concentrations of PDK inhibitors with respect to fully active PDK2. Enthalpies of binding computed at the PM6-DHX2 level of theory. Ligand efficiency.

	Restoration of PDC activity (%)				$-\Delta H_B$ (kcal/mol) PM6-DHX2	Ligand efficiency
	1 mM	0.1 mM	0.01 mM	0.001 mM		
1	–	–	–	–	8.72	1.30
2	107 ± 2	119 ± 4	55 ± 9	15 ± 8	36.61	4.96
3	25 ± 12	12 ± 8	–5 ± 8	–	40.80	4.57
4	93 ± 12	54 ± 8	26 ± 9	–	39.95	4.34
5	108 ± 9	36 ± 8	16 ± 8	–	27.98	3.35
6	37 ± 7	12 ± 15	–5 ± 18	–	23.58	2.41
7	76 ± 1	33 ± 6	12 ± 9	–	10.60	0.95
8	129 ± 8	75 ± 8	16 ± 10	–	25.67	2.66
9	38 ± 11	–4 ± 16	–	–	28.88	3.03
10	33 ± 8	5 ± 8	–	–	17.44	1.78
11	141 ± 8	47 ± 8	17 ± 8	–	37.31	3.85
12	103 ± 8	45 ± 8	16 ± 11	–	24.58	2.52
13	91 ± 1	29 ± 5	9 ± 5	–	25.80	2.67
14	40 ± 9	7 ± 9	8 ± 14	–	26.13	2.71
15	99 ± 8	47 ± 8	12 ± 9	–	33.46	3.52
16	75 ± 8	38 ± 9	4 ± 4	–	29.97	3.33
17	5 ± 9	–	–	–	29.43	2.53

potent compounds bear either a methyl or a bromo substituent in ortho position with respect to the carboxylate moiety and that **5**, the only tested compounds with no substituents, was active only at higher concentrations. Comparing the activities of **3** and **4**, we observed that while the 2-bromo derivative **4** is active, the 2-chloro derivative **3** is not. However, the thenoate **6** bearing the same substitution pattern as furoate **4** is essentially inactive. Instead, both 4-bromo (**12**) and 4-methyl (**11**) substitutions are beneficial, as it is 5-methyl (**8**). The presence of either a bromine or a chlorine atom at the 5th-position of the series of thenoates (compounds **10** and **9**, respectively) causes complete loss of activity. As for the 2-thenoate series, the most active compound, **15**, has a methyl group ortho to the carboxylate moiety, whereas **16**, with a hydroxyl group at the same position, is less active.

In order to evaluate the enthalpy of binding (ΔH_B) for each protein–ligand complex, the missing regions were added to 2BU8 by homology modelling and then the structure was relaxed through a series of energy minimization and molecular dynamics simulations cycles. Each protein–ligand complex was then minimized with different semi-empirical parameterization models, both with the COSMO solvent model and in the gas phase. The enthalpy of binding was computed as $[\Delta H_B = \Delta H_C - (\Delta H_P + \Delta H_L)]$, where ΔH_B is the enthalpy of binding, ΔH_C the heat of formation of the protein–ligand complex, ΔH_P the heat of formation of the protein and ΔH_L the heat of formation of the ligand. Ligand efficiency³⁷ was then calculated with the formula $[-\Delta H_B \times (ASA_C / ASA_L)]$, where ΔH_B is the computed enthalpy of binding, ASA_C is the solvent-ASA of

Figure 3. Correlation between percent restoration of PDC activity at 0.1 mM (x-axis) and computed ligand efficiency (y-axis).



the carbon atom and ASA_L is that of the ligand. This is approximately equivalent to the enthalpy of binding per atom adjusted to take atom size into account. Enthalpies of binding and ligand efficiency data are summarized in Table 1.

Figure 3 shows the correlation between enzymatic activity and ligand efficiency computed at the COSMO/PM6-DH2X level of theory. It must be noted that the chosen methodology has a number of limitations, which include neglecting the entropic term of the free energy of binding and the inaccurate estimation of the van der Waals interactions with semi-empirical methods.

It is, however, noteworthy that both COSMO/PM6-DH+ and COSMO/PM6-DH2X correctly predict that DCA is the most efficient ligand. Moreover, the higher level of theory employed, the better the statistical correlation between enzymatic activity and computed ligand efficiency we observe in relative terms. Thus, using the conductor-like screening model COSMO with the dielectric constant of water produced better results in all cases, except PM7, than the corresponding calculations at the homologous level of theory in the gas phase. As for the parameterisation model, plain PM6 and PM7 gave the worst results. Including hydrogen-bond corrections at the PM6-DH+ level of theory further improved the statistical correlation, whereas the best results were obtained when both hydrogen bond and halogen bond corrections as implemented in PM6-DH2X were used. Taken together, these results indicate that the predicted binding mode is correct for a significant number of the tested compounds.

Conclusion

Through enzymatic PDC activity assays we have identified several compounds bearing either furoate or thenoate scaffolds as PDK2 inhibitors. ^1H -STD-NMR experiments with the five most potent compounds and DCA demonstrated that they bind directly to PDK2. Competition experiments also demonstrated that the most potent compound competes with DCA for PDK2 binding. Taken together, these data indicate that, as predicted theoretically, the reported compounds inhibit PDK2 allosterically via binding to

its pyruvate-binding site, thus substantiating this small regulatory site as a druggable target and paving the way towards the design of novel inhibitors with improved pharmacological profiles.

Declaration of interest

The authors declare no competing financial interest. This work has received funding from the National Institutes of Health (M.S.P.) the Netherlands Organization for Scientific Research (A.K.H.H.) and the Dutch Ministry of Education, Culture and Science (A.K.H.H.). The National Institutes of Health (NIH) is acknowledged for Grant DK20478 to M.S.P. The Netherlands Organization for Scientific Research is acknowledged for Grant NWO-CW, ECHO-STIP to A.K.H.H. The Dutch Ministry of Education, Culture and Science for Gravitation Program Grant 024.001.035 to A.K.H.H.

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