

Biostructural, biochemical and biophysical studies of mutant IDH1

Received: 13 June 2023

Accepted: 15 August 2024

Published online: 09 September 2024

Mark A. McCoy^{1,2}✉, Jun Lu^{1,2}, F. Richard Miller¹, Stephen M. Soisson¹, Michael H. Lam¹ & Christian Fischer¹

We report bio-structural, bio-chemical and bio-physical evidence demonstrating how small molecules can bind to both wild-type and mutant IDH1, but only inhibit the enzymatic activity of the mutant isoform. Enabled through x-ray crystallography, we characterized a series of small molecule inhibitors that bound to mutant IDH1 differently than the marketed inhibitor Ivosidenib, for which we have determined the x-ray crystal structure. Across the industry several mutant IDH1 inhibitor chemotypes bind to this allosteric IDH1 pocket and selectively inhibit the mutant enzyme. Detailed characterization by a variety of biophysical techniques and NMR studies led us to propose how compounds binding in the allosteric IDH1 R132H pocket inhibit the production of 2-Hydroxy glutarate.

Mutations in the isocitrate dehydrogenase 1 (IDH1) gene have been observed in multiple human tumor types, with the highest prevalence seen in low-grade glioma (LGG) and secondary glioblastoma (GBM)^{1–4}. For example, a common subtype of LGG, astrocytoma, is up to 70% IDH1 mutant. In addition, 5–7% of AML patients harbor an IDH1 mutation, which, like in LGG and GBM, most commonly occurs on codon 132 where an arginine is replaced by a histidine (R132H). Prognosis in AML is adversely affected by IDH1 mutations with a trend for shorter overall survival, shorter progression-free survival, and a higher cumulative risk for relapse⁵. Other less common tumor types have also been shown to have high percentages of IDH1 mutations (e.g., Chondrosarcoma) or low percentages in more common tumors (e.g., melanoma)⁶.

Mutations in IDH1 typically occur at arginine 132 and a histidine (R132H) alteration is by far the most frequently observed amino acid alteration in patients. These mutations lead to a neomorphic gain of function, resulting in the production of (R)-2-Hydroxyglutarate (2HG) which is found in very high intratumoral and intracellular levels⁷. High 2HG levels, often found at mM levels intracellularly, have been shown to competitively inhibit dioxygenase enzymes which are involved in regulating epigenetic mechanisms associated with histone and DNA methylation, thereby promoting tumorigenesis⁸. The epigenetic dysregulation imparted by such IDH1 mutations is apparent in the hypermethylation phenotypes observed in tumor types bearing these alterations^{9,10}.

Inhibiting mutant IDH1 has been clinically validated, with ivosidenib (AG-120)¹¹ approved by the FDA for the treatment of relapsed/

refractory AML¹². Several other small molecule mutant IDH1 inhibitors, including IDH1/2 dual-inhibitor AG-881¹³, BAY-1436032¹⁴, GSK321¹⁵, IDH305¹⁶, FT-2102¹⁷, and others^{18,19}, have also shown efficacy in various preclinical and clinical studies, potentially offering new treatment options for different tumor types carrying IDH1 mutations.

We previously reported *in vivo* target validation studies in a BT142 orthotopic patient-derived glioma model, in which we saw a significant survival benefit in mice treated with our proprietary mutant IDH1 inhibitor MRK-A²⁰.

Here we report characterization of screening hits and their more potent analogs to better understand how they selectively inhibit mutant IDH1 but not the wild-type enzyme in biochemical and cellular assays. Data from binding studies, NMR spectroscopy, biochemical studies, and x-ray crystallography allow us to derive an allosteric mode of action for the inhibition of IDH1 R132H. In addition, we compare the binding of the MRK-A family to the binding of AG120, also known as Ivosidenib (Tibsovo®).

Results

Identification of IDH1^{R132H}-selective inhibitors

To identify selective inhibitors of IDH1^{R132H}, we executed a high throughput screen of our company's full 2 M compound screening library configured to identify inhibitors agnostic of their biochemical mechanism. We elected to screen the full collection of compounds available at MSD due to the anticipated challenge of finding mutant-selective inhibitors for a mutation where an arginine has been replaced

¹MRL, Merck & Co., Inc., Rahway, NJ, USA. ²These authors contributed equally: Mark A. McCoy, Jun Lu. ✉e-mail: mark.mccoy@merck.com

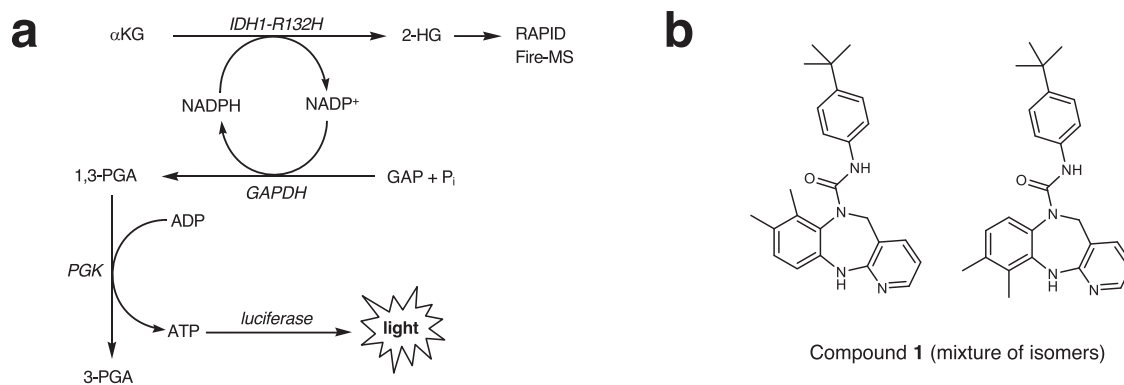


Fig. 1 | Coupled assay for the identification of IDH1^{R132H} inhibitors. a Assay description, **(b)** Structure of compound 1.

by another basic amino acid residue, a histidine. The high affinity of IDH1^{R132H} for NADPH ($K_d \sim 50$ nM) made it challenging to establish an assay sensitive to NADPH-competitive inhibitors while avoiding substrate depletion. To achieve this, we utilized two variations of an enzyme coupling system that allows continuous regeneration of NADPH via an NADPH-utilizing glyceraldehyde-3-phosphate dehydrogenase (GAPDH) from spinach. The 1,3-Bisphosphoglyceric acid formed in the NADPH regeneration reaction is then coupled to the formation of ATP via phosphoglycerate kinase (PGK). The ATP formed in the PGK reaction was then detected by firefly luciferase (Fig. 1a). An alternative form of this assay also utilized the NADPH regeneration system but directly detected 2HG using a high-throughput mass spectrometry system (Agilent Rapid Fire, Fig. 1a). This screening campaign led to the identification of compound 1, (Fig. 1b) a molecule that inhibited reductive 2HG production by IDH1^{R132H} ($IC_{50} = 48 \pm 59$ nM, $N=16$) but did not affect the activity of wild-type IDH1 in either the reductive (ICT formation) or oxidative (αKG formation) direction (IC_{50} of both reactions $> 20,000$ nM). Compound 1 also inhibited 2HG in MOG-G-UVW cells, stably transduced to overexpress IDH1^{R132H} ($IC_{50} = 0.7$ μM, $N=1$). Of note, compound 1 existed in our collection with high purity, but as an inseparable mixture of isomers stemming from the original synthetic route to this compound. Our studies commenced utilizing compound 1 but soon transitioned to compounds 2–4 (see compound optimization section).

Compound 1 thermally stabilizes IDH1^{R132H}

The interaction of compound 1 with IDH1^{R132H} and IDH1^{wt} was investigated using a thermal shift protein unfolding assay²¹. The inclusion of compound 1 (20 μM) stabilized IDH1^{R132H} by 5.3 degrees C, similar to NADPH but less than NADP⁺ (Table 1). Neither isocitrate nor αKG provided appreciable stabilization to thermal denaturation. However, when compound 1 was included along with NADPH or NADP⁺, the melting temperature was increased by > 4.4 degrees Celsius beyond that provided by either substrate alone, suggesting compound 1 and NADP⁺ or NADPH can bind IDH1^{R132H} simultaneously. In contrast, compound 1 did not thermally stabilize IDH1^{wt}, however, strong stabilization was provided by isocitrate, NADP⁺, and NADPH. In stark contrast to IDH1^{R132H}, the thermal stabilization of IDH1^{wt} by substrates was not altered by the presence of 20 μM compound 1.

Compound 1 binds IDH1^{R132H} and IDH1^{wt}

Compound 1 interaction with IDH1^{R132H} and IDH1^{wt} was further studied using a solution-based affinity selection mass spectrometry binding assay termed ALIS²². Titration of compound 1 into a solution containing 2 μM IDH1^{wt} or IDH1^{R132H}, surprisingly, showed saturable binding to both proteins (Fig. 2). Inclusion of isocitrate in the solution showed 86% displacement of compound 1 from IDH1^{wt} but not from IDH1^{R132H}. Similarly, the addition of 10 mM αKG resulted in the displacement of

67% of compound 1 from IDH1^{wt} but not from IDH1^{R132H}. Additional binding studies using Surface Plasmon Resonance (SPR) showed that compound 1 binds to IDH1^{R132H} and IDH1^{wt} with a K_d of 3 μM and 6 μM, respectively (Supplementary Note 1). SPR demonstrated similar binding of compound 1 to apo-IDH1^{R132H} and apo-IDH1^{wt} but the affinities are lower than from the biochemical data and Mass Spec binding data. SAR for compound optimization was guided by functional data from biochemical and cell-based assays.

Optimization of compound 1

We began a medicinal chemistry campaign to optimize compound 1 both in terms of potency as well as overall pharmaceutical properties. Upon examination of the available SAR from our initial screening as well as an analysis of our follow-up exploration with close similars of compound 1 in our collection, we soon appreciated that the dimethyl substitution, which led to the mixture of isomers, was unnecessary for affinity. Envisioning a simplified tricyclic core scaffold, we also sought to eliminate unnecessary hydrogen bond donors in our molecules and were pleased to find that compound 2, which replaced the urea with an amide moiety, retained the selectivity and activity for IDH1^{R132H} as evident from the data in Table 2. With compound 2 in hand as a simplified mutant IDH1 inhibitor, we set out to optimize both potency and overall pharmaceutical properties such as solubility and pharmacokinetic profiles. In addition, we were hoping to furnish an additional tool molecule for NMR studies that contained fluorine atoms to allow for ¹⁹F detection upon binding (for detailed results, see the NMR section). Through extensive SAR studies, we arrived at potent compounds such as compound 3, which boasted a significantly improved biochemical and cellular potency. While the introduction of compounds like 3 resulted in a boost in potency, it came at the expense of balanced

Table 1 | Thermal stabilization of IDH1^{wt} & R132H by substrates, co-factors and compound 1

IDH1 ^{wt} + 1 mM indicated substrate					
	No substrate	Isocitrate	NADP ⁺	NADPH	αKG
DMSO Only	52.2 ± 0.1	69.3 ± 0.1	58.4 ± 0.1	65.0 ± 0.1	53.7 ± 0.1
20 μM compound 1	52.5 ± 0.2	69.6 ± 0.1	58.2 ± 0.2	63.7 ± 0.2	53.2 ± 0.1
ΔTm (°C)	0.3	0.3	−0.2	−1.3	−0.5
IDH1 ^{R132H} + 1 mM indicated substrate					
	No substrate	Isocitrate	NADP ⁺	NADPH	αKG
DMSO Only	47.9 ± 0.1	48.0 ± 0.2	51.6 ± 0.1	62.1 ± 0.6	46.7 ± 0.2
20 μM compound 1	53.1 ± 0.4	52.9 ± 0.4	56.0 ± 1.1	67.2 ± 0.6	52.4 ± 0.1
ΔTm (°C)	5.3	4.9	4.4	5.1	5.7

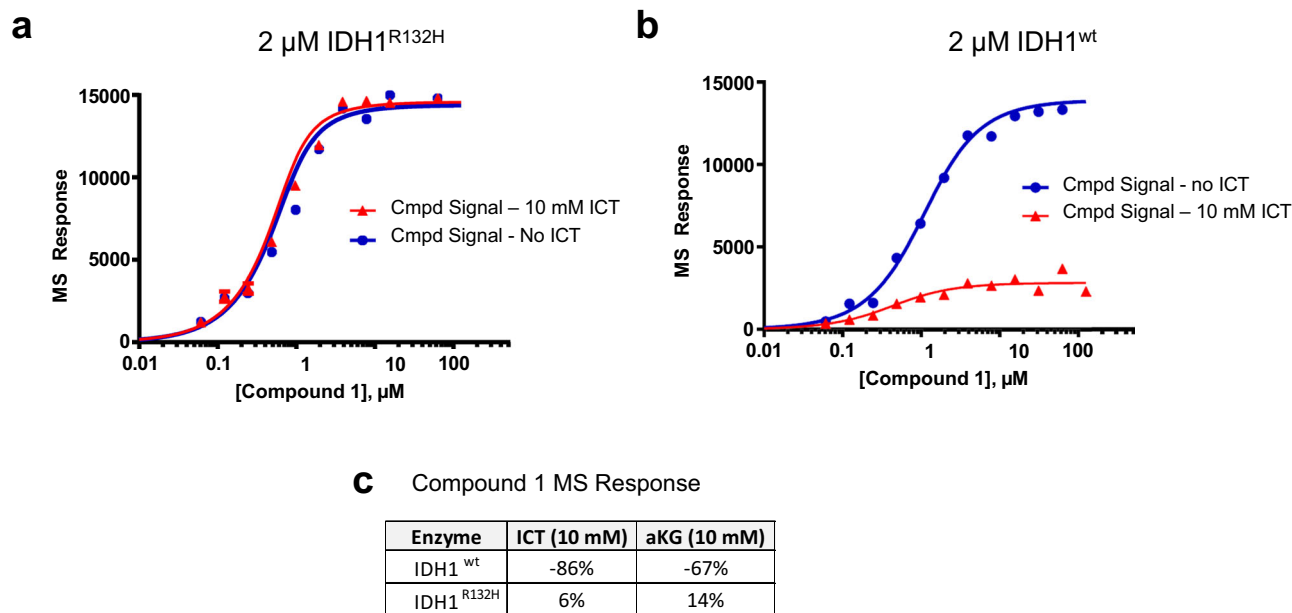


Fig. 2 | Mass Spec data for compound 1 binding to IDH1^{wt} and IDH1^{R132H} and substrate displacement. **a** Compound 1 titration showing (blue) binding to IDH1^{R132H} that is unaffected by the addition of 10 mM ICT (red). **b** Compound 1 titration showing (blue) binding to IDH1^{wt} that is decreased by the addition of 10 mM ICT (red). **c** Percent change of compound 1 MS response when binding to

IDH1^{R132H} or IDH1^{wt} in the presence of 10 mM ICT or aKG, when compared to compound 1 MS response for binding to apo-proteins. The above MS binding data confirms compound 1 binds both apo-IDH1^{wt} and apo-IDH1^{R132H} but shows that compound 1 binding is affected by substrate binding only for IDH1^{wt} and not mutant IDH1^{R132H}.

physicochemical properties and pharmacokinetic profiles. We profiled compound 3 quite extensively and have referred to it as MRK-A in our 2018 publication that reported the in vivo target validation studies we have conducted in an orthotopic patient-derived glioma model²⁰.

To arrive at a more beneficial overall profile, we investigated orthogonal opportunities to gain biochemical potency while achieving a more balanced overall profile. We learned that the introduction of certain substituents in the 8-position of the tricyclic core resulted in potency gains and a reduction of the lipophilicity of the amide substituent. In addition, we could install certain hindered alcohols where their hydrogen-bond-donor ability was sufficiently limited to eliminate undesired properties such as p-glycoprotein recognition. Optimized compound 4 ultimately combined all salient features and provided an advanced tool compound with good overall properties, potency, and a trifluoromethyl group to aid ¹⁹F NMR explorations. Figure 3 shows the progression from screening hit 1 to tool compounds 2–4. Subsequent optimization & characterization of this series of compounds as a lead series with salient pharmaceutical properties has been reported elsewhere²³. Table 2 summarizes the biochemical and cell activity data for compounds 1–4. Representative inhibition curves are shown in Supplementary Fig. 1. The synthesis of compounds 2–4 is described in Supplementary Note 2.

NMR binding and quenched functional assays

Direct IDH1 binding of weak high-throughput screening hits was confirmed using saturation transfer difference NMR spectroscopy (STD NMR). High-affinity compounds do not give an STD NMR signal; their binding was assessed through competition studies with low-affinity analogs, cofactors, and substrates. In one study (Fig. 4a, top) compound 1 affected IDH1^{R132H}-NADP⁺ interactions but did not compete directly with substrates or cofactors, consistent with an allosteric binding mechanism affecting the organization of the IDH1^{R132H} active site. While compound 1 and close analogs showed potent IDH1^{R132H} inhibition without affecting IDH1^{wt} activity, ALIS binding studies confirmed that compound 1 binds to both IDH1^{wt} and IDH1^{R132H}, prompting further biochemical, biophysical, and structural studies.

¹H NMR analysis of products and reactants from quenched IDH1 reactions was used as a label-free, orthogonal secondary assay to confirm functional IDH1^{R132H} inhibition, which might be complicated in coupled functional assays. Reactions monitored by NMR take place in deep well-plates or microliter scale sample tubes, can be initiated by enzyme, cofactor, or substrate addition, and quenched by heating or with the addition of a potent inhibitor. Solutions are transferred to an NMR tube and analyzed using ¹H NMR spectroscopy. Changes to products and reactants are quantitatively compared to control samples with no protein and samples with no ligand (DMSO only). Quenched functional NMR assays were used to confirm the activity of several IDH1^{R132H} hits and test for IDH1^{wt} selectivity. Results for compound 1 are shown in Fig. 4b, where 1 μM of IDH1^{R132H} enzyme was incubated with 20 μM inhibitor, 200 μM NADPH cofactor and initiated by aKG (alpha keto glutarate) substrate addition. In this experiment, compound 1 was confirmed to be a potent IDH1^{R132H} inhibitor with > 20-fold selectivity over the IDH1^{wt} reaction.

NMR of multicomponent oxidation-reduction reactions

NMR spectroscopy allows for individual small molecules to be detected and identified, and therefore provides a unique way to directly observe real-time, simultaneous structural changes to small molecule products and reactants in evolving IDH1 reactions (Fig. 4c). IDH1^{R132H} inhibition was tested in functional NMR assays where the time-dependent changes to the NMR signals of all reaction components (NADP⁺, NADPH, ICT, aKG, 2HG) were simultaneously detected and the concentration of each molecule was measured in “one-pot”. The results from several one-pot IDH1^{R132H} reactions are shown in Fig. 4d. While ICT is the natural substrate for IDH1^{wt}; it is also processed into aKG by IDH1^{R132H} in the samples containing DMSO and compound 1. IDH1^{R132H} is performing the wild-type reaction in the presence of R132H inhibitors. Samples with no inhibitor convert aKG into 2HG; 2HG production is blocked in the sample incubated with compound 1. IDH1^{R132H} inhibitors act by preventing the reduction of aKG and have little effect on ICT-to-aKG conversion. One pot IDH1^{wt} reactions yield similar results, rapidly producing aKG, then slowly producing 2HG.

Table 2 | Biochemical and cellular data for compounds 1–4

Compound	1	2	3	4
IDH1 wt IC ₅₀	> 20 μ M (n = 11)	> 20 μ M (n = 44)	> 20 μ M (n = 2)	> 20 μ M (n = 1)
IDH1 R132H IC ₅₀	48 \pm 59 nM (n = 16)	79 \pm 48 nM (n = 79)	6 \pm 2 nM (n = 5)	18 \pm 5 nM (n = 7)
IDH1 het dimer IC ₅₀	245 \pm 227 nM (n = 12)	705 \pm 232 nM (n = 67)	47 \pm 2 nM (n = 2)	297 nM (n = 1)
MOG R132H cellular IC ₅₀	0.7 μ M (n = 1)	1.3 \pm 0.9 μ M (n = 308)	66 \pm 20 nM (n = 4)	205 \pm 37 nM (n = 8)

IC₅₀ values were determined using a sigmoidal dose-response curve in Graph Pad Prism v10. Data are mean values \pm SD (Standard Deviation).

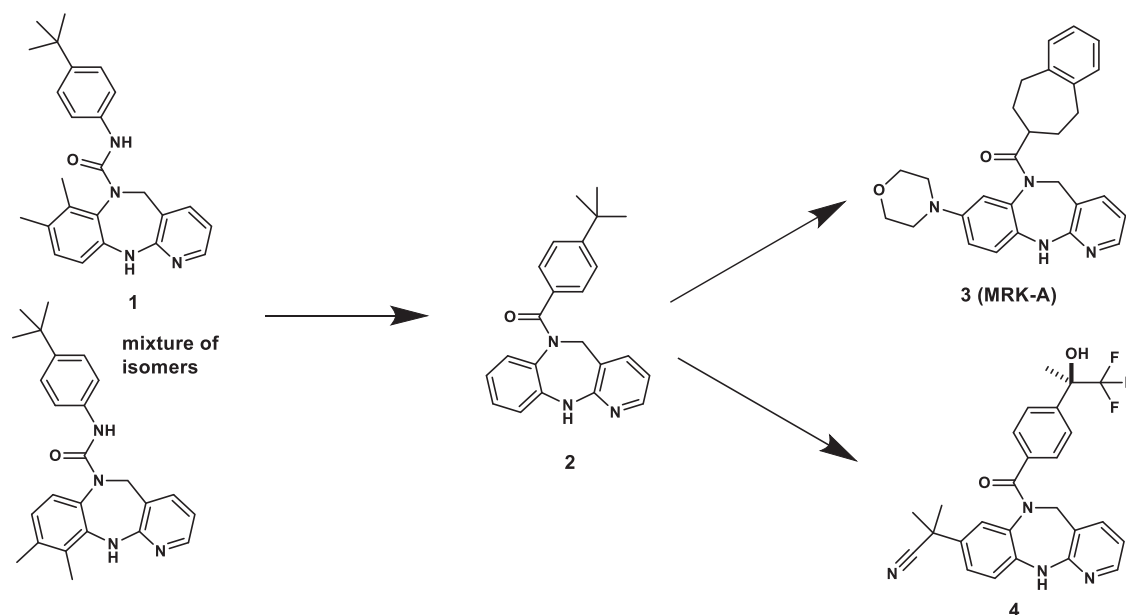


Fig. 3 | Structures of Mutant IDH1 inhibitors 1–4. Compound 1, identified from high-throughput screening, was evolved into more potent analogs 2–3 and an NMR tool compound 4.

2HG production from IDH1^{wt} has been previously noted²⁴. Rendina et al. ran IDH1^{wt} reactions using NADPH as a cofactor and aKG as a substrate. The addition of CO₂ yielded facile isocitrate production from aKG oxidation; when CO₂ was withheld, slow conversion of aKG to 2HG was observed by LCMS. The reaction proceeds slowly, producing 20 nM 2HG/min. We monitored the IDH1^{wt} reaction (aKG \rightarrow 2HG) by NMR for 60 h, which allowed for enough 2HG to accumulate for NMR detection. Earlier studies measured NADPH depletion in IDH1^{wt} reactions with aKG for 10 min and saw no measurable activity⁷. From our experiments, the IDH1^{R132H} enzyme, rather than being a gain of function mutation, appears to select for a conformation of the wild-type enzyme that favors 2HG production. NMR and biochemical data suggest that allosteric IDH1^{R132H} inhibitors bind and stabilize a wild-type-like conformation that is unfavorable for the reduction reaction.

Heterodimer NMR studies

Due to the presence of both mutant and wild-type alleles, IDH1^{wt/R132H} heterodimers are likely to be the predominant mutant IDH1 enzyme in the cell. NMR studies were carried out on IDH1^{wt/R132H} to investigate compound binding and heterodimer reaction details. One concern was the potential accelerated usage of aKG produced in the wild-type subunit that would be consumed locally by the IDH1^{R132H} subunit. One-pot reactions using the heterodimer enzyme (Fig. 4e) showed aKG pooling followed by consumption; local use⁷ was not dominant in the reactions that were studied. Direct ligand binding to IDH1^{wt/R132H} was studied by using the intrinsic ¹⁹F NMR signal of compound 4 as a local environment/conformational sensor. Figure 4f shows ¹⁹F NMR data collected from compound 4 complexes with IDH1^{wt}, IDH1^{R132H}, and IDH1^{wt/R132H} proteins. The presence of one well-defined 280 Hz peak

centered at -81.1 ppm for compound 4 binding to IDH1^{R132H} contrasts sharply with the two peaks observed for compound 4 binding to IDH1^{wt}; a major 160-Hz wide peak at -80.8 PPM and a minor 320-Hz wide peak centered at -81.1 PPM. More details are given in Supplementary Fig. 2 and Supplementary Note 3. These data are consistent with the fluorinated ligand sensing two IDH1^{wt} environments which could represent two conformations and one IDH1^{R132H} environment, consistent with a single conformation. Compound 4 interactions with IDH1^{wt} and IDH1^{R132H} are preserved in binding to IDH1^{wt/R132H}; no additional environmental or conformational complexity is introduced in the heterodimeric enzyme. While ¹⁹F NMR is well-suited as a probe of binding site differences, protein structures or protein NMR binding studies are needed to confirm that the ligand ¹⁹F NMR signal differences are related to protein conformation differences.

Deuterium incorporation NMR studies

A detailed mechanistic understanding of classical enzymatic kinetic studies of IDH1 enzymes is beyond the scope of our work. Nonetheless, some reaction details were revealed by performing IDH1 reactions in D₂O (Fig. 4g) where product deuteration occurs via transfer from solvent and protonation is cofactor-dependent. A series of proton 1H NMR spectra show time-dependent changes to NMR peaks as the substrate is converted to a product. Reactions that involve protonation due to rearrangements and/or transfer from a protonated cofactor can be directly detected; water protons will incorporate deuterium instead of hydrogen and will not be detected by 1H NMR. Typical experiments show decreases in 1H NMR signals due to direct deuterium replacement; changes to the splitting patterns of nearby J-coupled protons can also occur. From deuterium

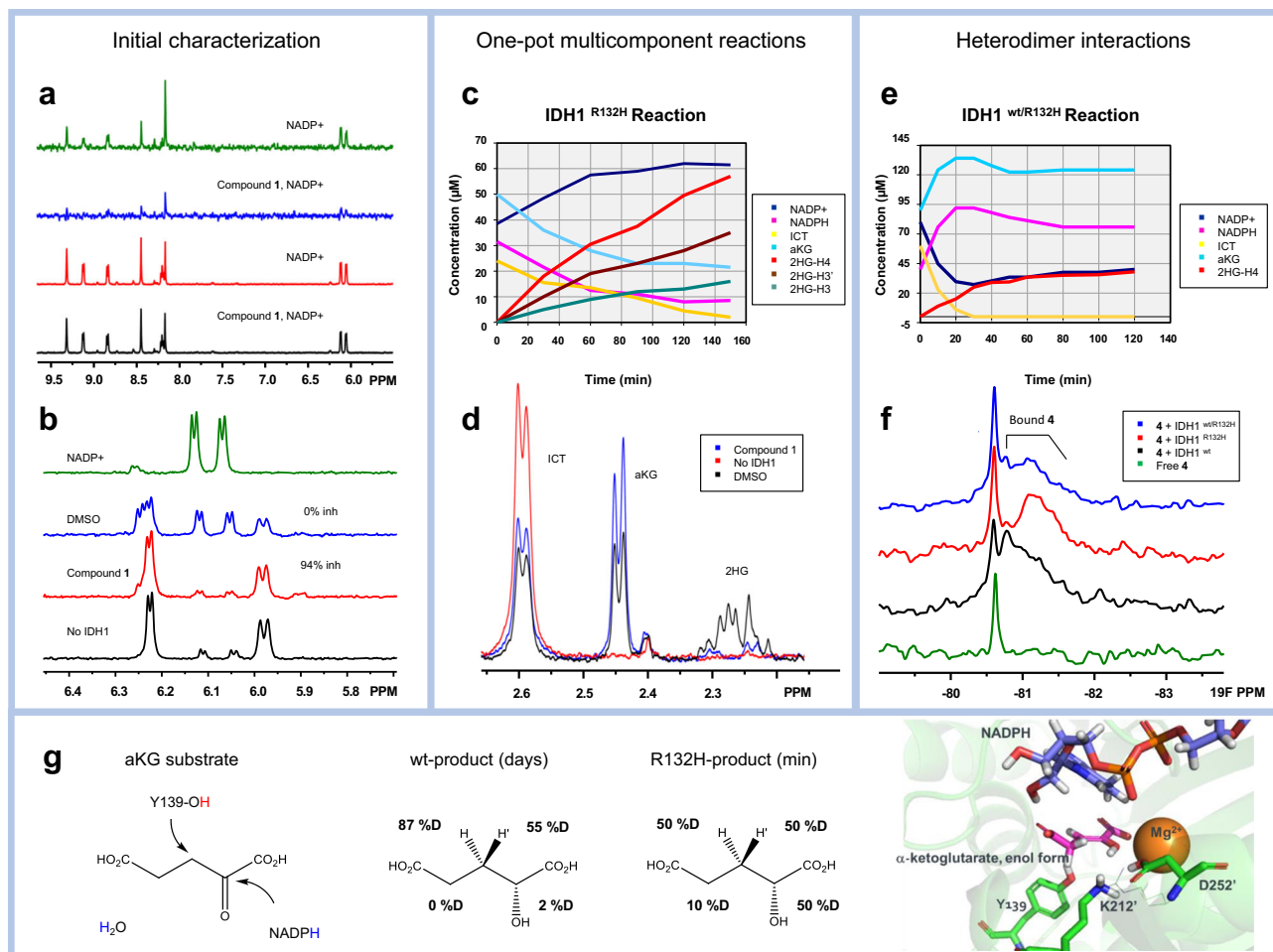


Fig. 4 | NMR biophysical studies of inhibitor binding and their effect on IDH1 reactions. **a** compound **1** binding to IDH1^{R132H} affects NADP⁺ interactions using ligand-detected STD NMR. **b** Changes in NADPH concentration are measured to assess IDH1^{R132H} inhibition by compound **1**. **c** All substrates and products from IDH1^{R132H} reduction and oxidation reactions can be monitored simultaneously using 1H NMR in “one pot” reactions. **d** Addition of compound **1** to the IDH1^{R132H} oxidation

reaction has little effect on ICT-to-aKG conversion (wild-type reaction) but inhibits aKG-to-2HG reduction. **e** Multicomponent IDH1^{wt/R132H} reaction monitoring shows aKG pooling. **f** ¹⁹F NMR studies of compound **4** complexes with IDH1^{wt} (black), IDH1^{R132H} (red), IDH1^{wt/R132H} (blue) enzymes and free in solution (green). **g** Differences in deuterium incorporation measured by 1H NMR suggest differences in processing aKG by IDH1^{wt} and IDH1^{R132H} enzymes.

incorporation differences when compared with IDH1^{wt}, we propose that the IDH1^{R132H} mechanism could involve the formation of an enol from aKG, followed by non-stereo selective protonation (Fig. 4g, right). These observations are consistent with transition state disruption that results in substrate/product release followed by non-specific deuteration from the solvent.

X-Ray Crystal structures of compound **1** and AG120

Multiple IDH1^{R132H} inhibitors of different classes have been reported in recent years, most of them bind to an allosteric pocket floored by β -sheet β_4 , β_5 , and β_{12} , surrounded by the loop connecting β_4 - β_5 , helix α_9 , and the beginning portion of β_{13} , and covered by helix α_{10} (Regulatory Element, Segment 2) on the top (Fig. 5a). Here we report the crystal structures of compound **1** in complex with IDH1^{R132H} homodimers at 2.2 Å (PDB: 8T7N), Fig. 5. One molecule of compound **1** binds to one protomer of IDH1^{R132H} homodimer. The overall structure of compound **1**:IDH1^{R132H} complex is in an open/inactive state²⁵. Compound **1** is a T-shaped molecule with a tricyclic core (dimethyl-5,11-dihydro-6 H-benzopyrido-1,4-diazepine) connected with a t-butylphenyl moiety at the center of the molecule. The core of compound **1** wedges in a parallel fashion into a groove formed by side chain walls of β strands (β_4 and β_5), and the interaction is stabilized by two pairs of hydrogen bonds between the nitrogen atoms of the core and

the backbone amide NH and carbonyl group of Ile128. The tricyclic core is further sandwiched by long hydrophobic side chains from both sides of the groove, including Met291, Arg109, Ile113, Ile128, and Ile130. The pyridine ring of the tricyclic core inserts into a hydrophobic sub-pocket underneath the loop connecting β_4 and β_5 . The limited size of this sub-pocket and the bidentate hydrogen bond interactions force the tricyclic core to align in a way only with the dimethyl-6H-benzo ring pointing toward Arg109 and His132. Only the 7,8-dimethyl isomer of compound **1** is found in the electron density map. The 9,10-dimethyl isomer, in contrast, would cause steric clashes with the β sheet. The t-butylphenyl sidechain of compound **1** sits perpendicularly to the tricyclic core and reaches out toward helix α_9 , engaging in mostly hydrophobic interactions with Leu120, Trp124, Met259, Val255, and Trp267. The highly dynamic helix α_{10} or the Seg2 is not resolved from the electron density map (neither is Seg1), probably due to lack of stable interaction with the compound and the intrinsic dynamic nature of the segment.

Even though compound **1** has a low inhibitory potency but a reasonable binding affinity against IDH1^{wt}, we managed to determine the structure of compound **1** in complex with IDH1^{wt} homodimer at 3.4 Å through co-crystallization at a high concentration of compound **1** (PDB: 8T7D). The binding mode of compound **1** in the IDH1^{wt} structure is in essence, identical to the one in IDH1^{R132H} (Supplementary Fig. 3).

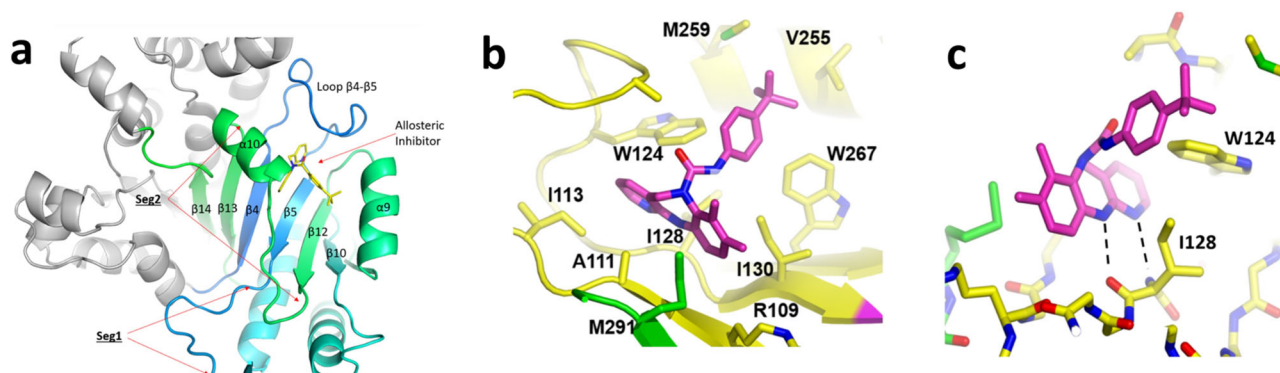


Fig. 5 | X-Ray Structure of IDH1^{R132H} in complex with compound 1. **a** The allosteric inhibitor binding pocket of compound 1:IDH1^{R132H}. **b** The hydrophobic interactions of compound 1. **c** The bidentate interaction of compound 1 with IDH1^{R132H}.

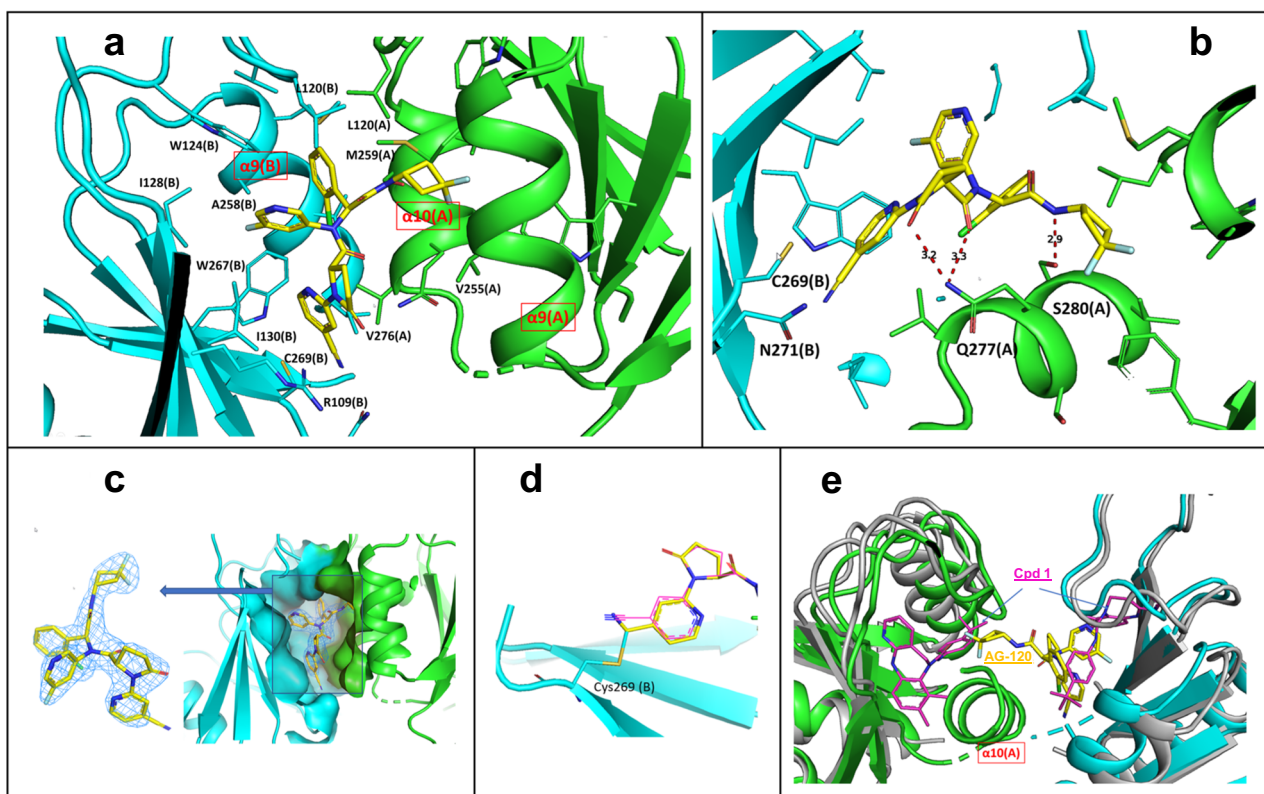


Fig. 6 | X-Ray Crystal Structure of IDH1^{R132H} complex with AG-120 (Ivosidenib). **a** AG-120 sits between the IDH1^{R132H} dimer interface, engaging in extensive hydrophobic interactions. **b** AG-120 forms a hydrogen bond with the side chain of Ser280 of chain A and is also within the hydrogen bond distance of the side chain of Ser277 (chain A). **c** The surface representation of AG-120 binding pocket. **d** The cyanide

pyridine end of AG-120 is situated next to the side chain of Cys269 of chain B, leading to the possibility that AG-120 might covalently modify Cys269 through its nitrile moiety (shown in yellow). **e** Comparisons of AG-120:IDH1^{R132H} and compound 1:IDH1^{R132H} crystal structures.

Both structures confirm that neither His132 nor Arg132 is directly involved in a binding interaction with compound 1. The X-ray crystal structure of IDH1^{R132H} in complex with compound 4 was also solved (PDB: 9B81) and an overlay with the compound 1 structure confirmed that two molecules bind nearly identically to the same pocket (Supplementary Fig. 4).

To further the understanding of the structural basis of the IDH1^{R132H} inhibitory mechanism by small molecules, we also determined the structure of IDH1^{R132H} in complex with AG-120 (Ivosidenib) at 2.05 Å (PDB: 8T70). The structure shows that AG-120 also binds at the allosteric pocket that is adjacent to the compound 1 binding site. However, there are two significant differences in the AG-120 binding mode compared with other allosteric inhibitors such as compound 1.

One molecule of AG-120 binds to one dimer of IDH1^{R132H} (Fig. 6a). AG-120 sits between the dimer interface, engaging in extensive hydrophobic interactions with Ile130, Trp124, Met259, Val255, and Trp267 of the protomer B. The regulatory element (Seg2) from protomer A forms a short helix (α10), and packs against AG-120 with hydrogen bonding and hydrophobic interaction. Seg2 of protomer A plays a pivotal role in bridging hydrophobic interactions between one AG-120 molecule and sidechains from helix α9 of two IDH1 protomers. AG-120 seems to form a hydrogen bond with the side chain of Ser280 of chain A and is also within hydrogen bond distance of the side chain of Ser277 (chain A) (Fig. 6b). The electron density around the ligand AG-120 is well resolved, except for the nitrile moiety (Fig. 6c). The cyanide pyridine end of AG-120 is intriguingly situated next to the side chain of Cys269

and Asn271 of chain B (Fig. 6b, d), leading to the possibility that AG-120 might covalently modify Cys269 through its nitrile moiety, though we don't have enough experimental evidence besides x-ray crystallography (Fig. 6d). The other end (the difluorocyclobutyl moiety) of AG-120 reaches out the helix $\alpha 9$ of protomer A (Met259), breaks the dimer symmetry of IDH1 and might prevent the 2nd copy of AG-120 binding to chain A, as observed in the binding mode of compound **1** in IDH1^{R132H} in which two copies of compound **1** bind to the protein. Comparisons of the binding mode of AG-120 with that of compound **1** are shown in Fig. 6e. The two copies of compound **1** exhibit essentially identical binding modes in chain A and chain B separately, while the AG-120 molecule spreads out and contacts both chain A and chain B.

Discussion

MRK-A belongs to a class of mutant IDH1 inhibitors, which we derived from high throughput screening (HTS). We and others in the field found that a wide range of chemotypes had the ability to bind to an allosteric pocket in IDH1^{R132H} and inhibit the mutant enzyme selectively over the wild type, which was unanticipated. To build our understanding of how such molecules appeared to selectively inhibit only the mutant but not the wild-type reaction in biochemical and cellular assay settings, we embarked on a biophysical and structural exploration that included binding studies via our Automated Ligand Identification System (ALIS) platform, NMR evaluation, biochemical studies, and x-ray crystallography.

We found early on that compounds from the MRK-A series can bind to both the wild-type as well as the mutant enzyme, but only inhibit the neomorphic enzymatic activity of the mutant. Binding to the wild-type and mutant enzyme was confirmed by ALIS, SPR, and NMR as well as by x-ray crystallography. In addition, in all crystal structures we obtained with this series, compounds are always bound to the wild-type and the mutant enzyme in the exact same binding mode. While several compounds in this series, such as MRK-A, possess functional groups that project towards the mutated residue, no direct interaction was apparent that could explain the selectivity observed. Furthermore, compounds that lacked such substitution patterns or bound at a significant distance from the mutant residue still appeared to be selective inhibitors. Faced with such unanticipated findings, we sought to better understand how these compounds bind to IDH1 and under which conditions. We established, with competition experiments, how substrates can compete off compounds such as compound **1** from the allosteric pocket of the wild type, but not the mutant enzyme. Therefore, while compounds could bind in the absence of substrates, under physiologically relevant conditions, the wild-type enzyme regains catalytic activity by competitively displacing the allosteric ligand, whereas the mutant cannot. In the mutant context, the allosteric ligand can bind in the presence of substrates and further stabilize the protein.

To better understand the unexpected behavior of these mutant-selective inhibitors, we conducted comprehensive NMR and biochemical/biophysical studies with both the wild type, mutant, and importantly also with the dimer consisting of one wild type and one mutant copy, a scenario that more closely resembles a cellular setting where wild type and mutant enzymes co-exist. We confirmed how mutant-selective inhibitors affect the interconversion of the substrate to the product over time, which has allowed us to obtain detailed information not only on how the homodimeric mutant and wildtype enzyme behave but importantly also on how the heterodimeric units of one wildtype and one mutant have the ability to perform the wild-type and mutant reaction, respectively. Our NMR studies explain how the heterodimeric IDH1 dimer first oxidatively processes ICT to form 2-OG which then serves as the substrate for the mutant counterpart to ultimately produce 2HG. We were able to show under such conditions that our mutant-specific inhibitors were able to effectively suppress the mutant reaction, but still allowed for the processing of ICT to 2-OG.

This data is consistent with our enzymology studies, which similarly confirmed our inhibitors, such as compound **1** or MRK-A only inhibit the mutant 'reductive' reaction of the heterodimeric enzyme, whereas the 'oxidative' wild-type reaction was not affected.

Lastly, we studied the binding of our compounds to the allosteric binding site by x-ray crystallography, both in the wild type and the mutant enzyme, and further explored by NMR spectroscopy. ¹⁹F NMR characterized environmental differences, suggesting conformational changes to wild-type and mutant IDH1 enzymes. Data from these orthogonal techniques is consistent with the wild-type enzyme sampling multiple conformations while the R132H mutation selects a conformation that is favorable for compound **2** binding. Conformational information comes indirectly from a comparison of compound **4** CF₃ signals bound to wt, R132H, and heterodimer proteins. We obtained high-quality x-ray crystallographic data for several structural classes we had identified through our medicinal chemistry campaign, which bound in different pockets of the large allosteric binding site of the IDH1 protein. We compared the binding of our compounds from the MRK-A series to the binding of AG120, also known as Ivosidenib (Tibsovo®) for which we determine the x-ray crystal structure, which was previously unknown. It has long been speculated that AG-120 directly binds to Cys269, however, to date only indirect evidence is available. While in our crystallographic analysis, we observe a shortened distance between AG-120 and Cys269, which is consistent with a bond that has formed between the sulfur of Cys269 and the heterocyclic nitrile in AG-120, we do not have biochemical or cellular data to support the relevance of this observation. Interestingly, while compounds represented by **1–4** bind quite distal to the AG-120 binding site, they similarly confer high mutant selectivity.

Taking our biochemical, -physical, and -structural studies together led us to derive a proposed mode of action for the mutant IDH1 enzyme that is consistent with all our data and the emerging reports from others in the field. While inhibitors of the mutant enzyme can bind both wild-type and mutant enzymes, the highly dynamic nature of the wild-type in the presence of substrates does not allow for the formation of the closed inactive conformation, substrates rather displace the ligand from the wild-type enzyme. Binding to the mutant enzyme in contrast leads a stable closed protein conformation that can no longer bind substrates and is thus not catalytically competent.

Methods

Protein production

Genes encoding IDH1(1-414) and IDH1(1-414 with R132H mutation) were cloned into pET41a vector and expressed in *E. coli* BL21(DE3) cells as C-terminal His-tagged proteins. Each protein was purified by Ni-NTA column followed by gel-filtration chromatography (Superdex S200 column). Heterodimer protein was produced using 6His-IDH1(1-414) and IDH1(1-414)R132H-FLAG plasmids that were cloned into pET41a vector and expressed in *E. coli* BL21(DE3) cells. Cells were incubated at 37 °C until reaching an OD₆₀₀ = 0.6 - 0.8, transferred to 16 °C, induced with 0.5 mM IPTG, and incubated overnight. After pelleting, cells were suspended in a 50 mM Tris-HCl buffer, pH 7.5, 500 mM NaCl, 10% glycerol, 5 mM β ME, and EDTA-free protease inhibitor cocktail tablets, then lysed using a microfluidizer, passing through twice to ensure complete cell lysis, then centrifuged at 28,000 $\times g$ for 45 min at 4 °C. The protein was loaded onto a Ni-NTA column, washed with wash buffer (50 mM Tris-HCl, pH 7.5, 500 mM NaCl, 10% glycerol, 5 mM β ME, and 10 mM imidazole), and eluted with elution buffer (50 mM Tris-HCl, pH 8.3, 150 mM NaCl, 10% glycerol, 5 mM β ME, and 500 mM imidazole). Fractions were pooled, bound to an anti-FLAG M2 column, washed with 50 mM Tris-HCl, pH 7.5, 500 mM NaCl, 10% glycerol, 5 mM β ME, and eluted with FLAG elution buffer (50 mM Tris-HCl, pH 8.3, 150 mM NaCl, 10% glycerol, 5 mM β ME and 100 μ g/mL FLAG peptide). Fractions were pooled and run on a Superdex 75 26/60 SEC column using the 50 mM HEPES, pH

7.5, 200 mM NaCl, 10% glycerol, 10 mM MgCl₂, and 2 mM DTT storage buffer.

Crystallization

IDH1^{wt} (10 mg/ml) was co-crystallized with compound **1** (at 1:10 molar ratio) by hanging-drop vapor diffusion method using a reservoir containing 0.1 M Sodium Cacodylate, pH6.5, 0.2 M NaCl, 2 M Ammonium Sulfate. IDH1^{R132H} (18 mg/ml) was co-crystallized with compound **1** or AG-120 (at 1:10 molar ratio) by hanging-drop vapor diffusion method using a reservoir containing 25% PEG3350, 0.45 M Di-Ammonium Tartrate. Crystals were cryoprotected with 25% (v/v) sterile glycerol before being snap-frozen in liquid nitrogen.

X-ray data collection, processing & structure determination

X-ray diffraction data were collected at beamline 17-ID of the Advanced Photon Source at Industrial Macromolecular Crystallography Association (IMCA), Argonne National Laboratory at a wavelength of 1.0 Å. All data were integrated using either HKL2000²⁶ or XDS²⁷ and merged and scaled using either HKL2000²⁶, autoPROC²⁸, and Aimless in the CCP4²⁹ suite of programs.

The structures for IDH1^{wt} with compound **1**, IDH1^{R132H} with compounds **1** and **4**, and the IDH1^{R132H}:AG-120 complex were determined by molecular replacement with the program Phaser³⁰ using the previously reported structures of IDH1 (PDB: 3MAP) as the search models respectively. The molecular models were built manually using Coot³¹ and completed using iterative rounds of refinement and rebuilding. The structures were refined using REFMAC³² as implemented in CCP4²⁹ and Buster³³ (GlobalPhasing Ltd.). The final models all have favorable R/R free values, Molprobit³⁴ scores, and good geometry and stereochemistry. The final structures have been deposited with the RCSB protein data bank. Structure determination statistics are provided in Supplementary Table 1. Figures were prepared using the program PyMOL (Schrödinger LLC, version 1.8).

Thermal shift assay

The thermal denaturation of both IDH1^{wt} and IDH1^{R132H} enzymes were evaluated in their apo-form, with and without compound **1** and in combination with and without substrate: isocitrate, NADP⁺, NADPH, and alpha-ketoglutarate. In a buffer consisting of 50 mM Tris, pH 7.5, 250 mM sodium chloride, and 5 mM magnesium chloride, a 5 µL mixture containing 4 µM IDH1^{wt} or 2 µM IDH1^{R132H}, DMSO or 20 µM compound **1** and 200 µM 1,8-ANS (1-anilinonaphthalene-8-sulfonic acid) dye was dispensed into a 384-well plate. All substrates were tested at 1 mM. To the top of each well, 3 µL of mineral oil was added. The samples were subjected to a continuous increase of 1 °C/min from 35 °C to 80 °C on the ThermoFluor® 384ELS System (Johnson & Johnson). The fluorescence intensity was plotted vs temperature to calculate the melting temperature for each sample. Data represents the average of 4 replicates ± standard deviation.

NMR spectroscopy

STD and 1D NMR spectra were collected on a Bruker DRX 500 MHz spectrometer equipped with a 5 mm TCI CryoProbe. 19 F NMR spectra were collected on a Bruker Avance III 500 MHz spectrometer using a 5 mm QCI CryoProbe. All datasets were acquired at a sample temperature of 303 K and processed using Bruker TopSpin software, v2.1 (or higher), or MestreNova 14.2.

STD NMR

Ligand binding was detected by saturation transfer difference (STD) NMR spectroscopy. We used a 1D proton STD experiment (std19slsp) with 3-9-19 WATERGATE solvent suppression and shaped pulse saturation (50 ms Gaussian pulses, 3 sec) applied at on- and off-

resonance saturation frequencies of −120 Hz (−0.234 PPM) and 20,000 Hz, respectively. Key experimental parameters include: 1280 scans, 8 K total data points, 8012 Hz (16 PPM) sweep width, 3 sec relaxation delay, 511 ms acquisition time, and a total experiment time (expt) of 2 hours. The time domain data was multiplied by a Lorentzian window function (EM, 1 Hz) prior to transformation. The effect of compound binding on NADP⁺ (Fig. 4a) was assessed on a sample consisting of 2 µM IDH1^{R132H}, 130 µM NADP⁺, and 10 mM MgCl₂ in 50 mM phosphate pH 7.0 buffer, 50 mM NaCl.

19 F NMR

Direct IDH1 binding of fluorinated compounds (Fig. 4f) was detected by 19 F NMR, using a proton decoupled, 19 F detected experiment (zgfhigqn). Key experimental parameters include: 1280 scans, 32 K total data points, 37.5 kHz (80 PPM) sweep width, 2.8 s relaxation delay, 436.9 ms acquisition time, and a total experiment duration of 7 hrs. 16 min. The time domain data was multiplied by a Lorentzian window function (EM, 30 Hz) prior to transformation. Samples consisted of 10 µM compound added to 9.2 µM IDH1^{R132H} in a 25 mM TRIS pH 7.1 buffer, 100 mM NaCl.

NMR Inhibitor studies

Quenched reaction monitoring to detect enzyme inhibition by screening hits (Fig. 4b) was accomplished using a conventional proton-detected experiment with presaturation solvent suppression (zgpr). Reactions were carried out in a 1.5 ml Eppendorf tube. 20 µM compound was added to a reaction mixture containing 2 µM IDH1^{R132H}, 200 µM NADPH, 200 µM aKG in 50 mM phosphate pH 7.0 H₂O/D₂O buffer, 50 mM NaCl. The reaction was initiated by the addition of 5 mM MgCl₂ and quenched after 100 min by heating. The contents were transferred to an NMR tube for analysis. Percent inhibition was calculated using NADPH integrals, relative to a sample with no enzyme. A weak aKG-competitive inhibitor of IDH1^{R132H}, NOG (N-oxalylglycine), was used as a positive control.

NMR continuous “one pot” reaction monitoring

Unlike quenched experiments, evolving reactions take place in an NMR tube and are monitored directly in a series of 1D proton experiments. Continuous reaction monitoring was accomplished using a conventional proton-detected zgpr experiment. Key experimental parameters include: 40 scans, 32 K total data points, 6666 Hz (13.3298 PPM) sweep width, 2.0 s relaxation delay, 2.45 sec acquisition time, and a total experiment duration of 10 min. The time domain data was multiplied by a Lorentzian window function (EM, 1 Hz), transformed, and a baseline correction was applied using a 5th order polynomial function.

One pot IDH1^{R132H} reactions (Fig. 4c, d) were carried out in the NMR tube, at 303 K. The zgpr experiment was used to monitor the 1H NMR spectrum for all molecules in the reaction mixture for 120 min at 10 min intervals. The reaction mixture includes: 2 µM IDH1^{R132H}, 200 µM NADPH, 200 µM aKG in 50 mM phosphate pH 7.0 H₂O/D₂O buffer, and 50 mM NaCl. The reaction was initiated by the addition of 5 mM MgCl₂ to the NMR sample tube. The tube was then placed in the magnet and shimmed, resulting in a dead time of ~6 min. Integrals for products and reactants are plotted versus time, using the starting reactant integrals as references for reactant/product concentrations.

One pot IDH1^{wt/R132H} reactions (Fig. 4e) were carried out in the NMR tube, at 303 K. Reaction progression was monitored for 150 min. at 10-minute intervals by 1H NMR. The reaction mixture includes: 100 nM IDH1^{wt/R132H}, 200 µM NADPH, 3 mM aKG in 50 mM phosphate pH 7.0 H₂O/D₂O buffer, and 50 mM NaCl. The reaction was initiated by the addition of 5 mM MgCl₂ to the NMR sample tube. Sample loading, acquisition and data treatment were the same as was used for the IDH1^{R132H} experiments.

Reporting summary

Further information on research design is available in the Nature Portfolio Reporting Summary linked to this article.

Data availability

Structural data has been deposited with the Protein Data Bank. Accession codes are **8T7N** for IDH1^{R132H}-compound **1**, **8T7D** for IDH1^{wt}-compound **1**, **9B81** for IDH1^{R132H}-compound **4** and **8T7O** for IDH1^{R132H}-AG120 complexes. Data collection and refinement statistics are included in Supplementary Table 1. Representative dose-response curves for compounds **1–4** are in Supplementary Fig. 1. SPR binding data and protocols are in Supplementary Note 1. Synthesis of compounds **2–4** are in Supplementary Note 2. NMR experimental details are in Supplementary Note 3 and Supplementary Fig. 2. Protocols for biochemical and cell assays are in Supplementary Note 4. Ligand electron densities are shown in Supplementary Fig. 3. Source data are provided in this paper.

References

- Balss, J. et al. Analysis of the IDH1 codon 132 mutation in brain tumors. *Acta Neuropathol.* **116**, 597–602 (2008).
- Cairns, R. A. & Mak, T. W. Oncogenic isocitrate dehydrogenase mutations: mechanisms, models, and clinical opportunities. *Cancer Discov.* **3**, 730–741 (2013).
- Parsons, D. W. et al. An integrated genomic analysis of human glioblastoma multiforme. *Science* **321**, 1807–1812 (2008).
- Yan, H. et al. IDH1 and IDH2 mutations in gliomas. *N. Engl. J. Med.* **360**, 765–773 (2009).
- Schnittger, S. et al. IDH1 mutations are detected in 6.6% of 1414 AML patients and are associated with intermediate risk karyotype and unfavorable prognosis in adults younger than 60 years and unmutated NPM1 status. *Blood* **116**, 5486–5496 (2010).
- Cimino, P. J., Kung, Y., Warrick, J. I., Chang, S. H. & Keene, C. D. Mutational status of IDH1 in uveal melanoma. *Exp. Mol. Pathol.* **100**, 476–481 (2016).
- Dang, L. et al. Cancer-associated IDH1 mutations produce 2-hydroxyglutarate. *Nature* **462**, 739–744 (2009).
- Xu, W. et al. Oncometabolite 2-hydroxyglutarate is a competitive inhibitor of alpha-ketoglutarate-dependent dioxygenases. *Cancer Cell* **19**, 17–30 (2011).
- Cooper, L. A. et al. The proneural molecular signature is enriched in oligodendrogliomas and predicts improved survival among diffuse gliomas. *PLoS ONE* **5**, e12548 (2010).
- Noushmehr, H. et al. Identification of a CpG island methylator phenotype that defines a distinct subgroup of glioma. *Cancer Cell* **17**, 510–522 (2010).
- Popovici-Muller, J. et al. Discovery of AG-120 (Ivosidenib): A first-in-class mutant IDH1 inhibitor for the treatment of IDH1 mutant cancers. *ACS Med. Chem. Lett.* **9**, 300–305 (2018).
- Dhillon, S. Ivosidenib: first global approval. *Drugs* **78**, 1509–1516 (2018).
- Kontaxis, Z. et al. Vorasidenib (AG-881): A first-in-class, brain-penetrant dual inhibitor of mutant IDH1 and 2 for treatment of glioma. *ACS Med. Chem. Lett.* **11**, 101–107 (2020).
- Chaturvedi, A. et al. Pan-mutant-IDH1 inhibitor BAY1436032 is highly effective against human IDH1 mutant acute myeloid leukemia in vivo. *Leukemia* **31**, 2020–2028 (2017).
- Okoye-Okafor, U. C. et al. New IDH1 mutant inhibitors for treatment of acute myeloid leukemia. *Nat. Chem. Biol.* **11**, 878–886 (2015).
- Cho, Y. S. et al. Discovery and evaluation of clinical candidate IDH305, a brain penetrant mutant IDH1 inhibitor. *ACS Med. Chem. Lett.* **8**, 1116–1121 (2017).
- Caravella, J. A. et al. Structure-based design and identification of FT-2102 (Olutasidenib), a potent mutant-selective IDH1 inhibitor. *J. Med. Chem.* **63**, 1612–1623 (2020).
- Lin, J. et al. Discovery and optimization of quinolinone derivatives as potent, selective, and orally bioavailable mutant isocitrate dehydrogenase 1 (mIDH1) inhibitors. *J. Med. Chem.* **62**, 6575–6596 (2019).
- Rohde, J. M. et al. Discovery and optimization of 2H-1lambda(2)-Pyridin-2-one inhibitors of mutant isocitrate dehydrogenase 1 for the treatment of cancer. *J. Med. Chem.* **64**, 4913–4946 (2021).
- Kopinja, J. et al. A brain penetrant mutant IDH1 inhibitor provides in vivo survival benefit. *Sci. Rep.* **7**, 13853 (2017).
- Zhang, R. & Monsma, F. Fluorescence-based thermal shift assays. *Curr. Opin. Drug Discov. Devel.* **13**, 389–402 (2010).
- Annis, D. A., Nickbarg, E., Yang, X., Ziebell, M. R. & Whitehurst, C. E. Affinity selection-mass spectrometry screening techniques for small molecule drug discovery. *Curr. Opin. Chem. Biol.* **11**, 518–526 (2007).
- Huang, C. et al. Diminishing GSH-adduct formation of tricyclic diazepine-based mutant IDH1 inhibitors. *ACS Med. Chem. Lett.* **13**, 734–741 (2022).
- Rendina, A. R. et al. Mutant IDH1 enhances the production of 2-hydroxyglutarate due to its kinetic mechanism. *Biochemistry* **52**, 4563–4577 (2013).
- Yang, B., Zhong, C., Peng, Y., Lai, Z. & Ding, J. Molecular mechanisms of “off-on switch” of activities of human IDH1 by tumor-associated mutation R132H. *Cell Res.* **20**, 1188–1200 (2010).
- Otwinowski, Z. & Minor, W. Processing of X-ray diffraction data collected in oscillation mode. *Methods Enzymol.* **276**, 307–326 (1997).
- Kabsch, W. Xds. *Acta Crystallogr D Biol. Crystallogr.* **66**, 125–132 (2010).
- Vonrhein, C. et al. Data processing and analysis with the autoPROC toolbox. *Acta Crystallogr D Biol. Crystallogr.* **67**, 293–302 (2011).
- Winn, M. D. et al. Overview of the CCP4 suite and current developments. *Acta Crystallogr D Biol. Crystallogr.* **67**, 235–242 (2011).
- McCoy, A. J. et al. Phaser crystallographic software. *J. Appl. Crystallogr.* **40**, 658–674 (2007).
- Emsley, P. & Cowtan, K. Coot: model-building tools for molecular graphics. *Acta Crystallogr D Biol. Crystallogr.* **60**, 2126–2132 (2004).
- Murshudov, G. N. et al. REFMAC5 for the refinement of macromolecular crystal structures. *Acta Crystallogr D Biol. Crystallogr.* **67**, 355–367 (2011).
- Bricogne, G. et al. BUSTER version 2.11.6. (Cambridge, United Kingdom: Global Phasing Ltd., 2016).
- Chen, V. B. et al. MolProbity: all-atom structure validation for macromolecular crystallography. *Acta Crystallogr D Biol. Crystallogr.* **66**, 12–21 (2010).

Acknowledgements

The authors wish to acknowledge the assistance with experiments (Brian Lacey, Peter Spacciapoli, Anthony Donofrio, Xiaohua Huang, Gopal Parthasarathy, Pravien Abeywickrema) and discussions of the results (Astrid Kral, John Lampe, Elliott Nickbarg, Daniel Klein, Christine Andrews) described in the publication.

Author contributions

J.L., M.M., R.M., S.S., M.L., and C.F. were involved in experimental design. J.L., M.M., R.M., M.L., and C.F. contributed to data collection and/or interpretation. J.L., M.M., and C.F. contributed to writing the paper.

Competing interests

J.L., M.M., R.M., S.S., M.L., and C.F. are current or former employees of Merck Sharp & Dohme LLC, a subsidiary of Merck & Co., Inc., Rahway, NJ, USA and may own stock or stock options in Merck & Co., Inc., Rahway, NJ, USA.

Additional information

Supplementary information The online version contains supplementary material available at <https://doi.org/10.1038/s41467-024-51692-0>.

Correspondence and requests for materials should be addressed to Mark A. McCoy.

Peer review information *Nature Communications* thanks the anonymous reviewers for their contribution to the peer review of this work. A peer review file is available.

Reprints and permissions information is available at <http://www.nature.com/reprints>

Publisher's note Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

Open Access This article is licensed under a Creative Commons Attribution-NonCommercial-NoDerivatives 4.0 International License, which permits any non-commercial use, sharing, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons licence, and indicate if you modified the licensed material. You do not have permission under this licence to share adapted material derived from this article or parts of it. The images or other third party material in this article are included in the article's Creative Commons licence, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons licence and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this licence, visit <http://creativecommons.org/licenses/by-nc-nd/4.0/>.

© Merck & Co., Inc., Rahway, NJ, USA and its affiliates 2024