

Supplementary Information for InstructPLM: Aligning Protein Language Models to Follow Protein Structure Instructions

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The PDF file includes:

Supplementary Table 1 to Supplementary Table 7 and Supplementary Figure 1 to
Supplementary Figure 4.

Supplementary Results

Implementation Details

To ensure the reproducibility of our results and facilitate the understanding of our
model’s architecture, we provide a detailed description of the hyperparameter and
training settings employed in InstructPLM.

Initialization

- **Linear Layers:** The weight parameters of the linear layers are initialized using a truncated normal distribution with a mean of 0 and a standard deviation of 0.02. The biases are initialized to zero.
- **Layer Normalization:** The weights and biases of the layer normalization modules are uniformly initialized to 1.0 and 0, respectively. This initialization scheme ensures a standardized starting point for the training process.

Hyperparameters

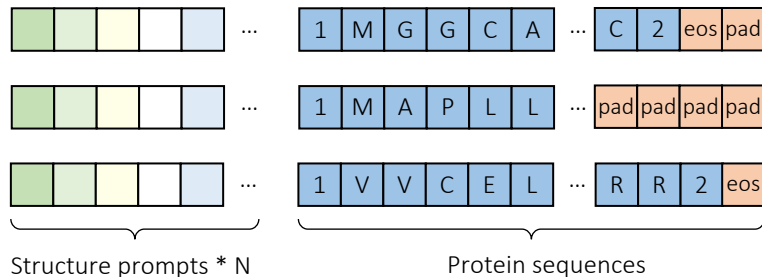
We show our model hyperparameters and training configuration in Supplementary Table 1.

Supplementary Table 1 Summary of model hyperparameters.

Hyperparameter	Value	Description
<i>Model</i>		
Max length	512	Max number of amino acids of input structures.
Learnable Queires	256	Number of learnable queries.
Number of Heads	16	Number of heads in multi-head cross attention.
<i>Generation</i>		
Temperature	0.15/0.8	Control the diversity of generated sequences.
Top-p	0.9	Control the diversity of generated sequences.
<i>Training</i>		
Learning Rate	0.0001	Learning rate for the optimizer.
Batch Size	16	Number of samples per step.
Data Parallel	4	Number of batches per step.
Epochs	200	Number of times to iterate over the entire dataset.
Warmup Steps	5000	Number of steps to gradually increase the learning rate at the beginning of training.
Weight Decay	0.1	Penalizing large weights.
Precision Training Mode	bfloat16	Utilizes bfloat16 for mixed precision training.
Optimizer	Adam	Optimization method for updating weights.
Loss Function	Cross-Entropy	Loss function for training the model.

Tokenizer

We use the same tokenizer as the original ProGen2. The vocabulary of the tokenizer comprises 30 tokens, including 20 amino acids, 5 special tokens, and 5 unused tokens. Among the 5 special tokens, we use ‘1’ and ‘2’ to represent the N-terminal and C-terminal sides of the protein sequence respectively, representing the end of the sequence by the end-of-sequence token ($\langle eos \rangle$). To handle sequences with different lengths, the padding token ($\langle pad \rangle$) will be added at the end of the sequences. Since the structure prompt is added at the beginning of the protein sequence to indicate the start of the sequence, thus we do not use the $\langle bos \rangle$ token. Fig. 1 shows an example of a constructed data batch.



Supplementary Fig. 1 Illustration of batch construction. We concat the structure prompt with protein sequence to train the InstructPLM, and special tokens '1', '2', $\langle eos \rangle$ and $\langle pad \rangle$.

Supplementary Table 2 Perplexity with/without special tokens.

Model	Perplexity on CATH 4.2↓		
	Short	Single-chain	All
InstructPLM- <i>full vocab.</i>	3.28	3.20	2.71
InstructPLM	3.22	3.17	2.68

Training and Evaluation

During the training phase, following [1–4] we first filter the CATH 4.2 dataset with sequence lengths less than 500. We exclude the loss calculation of the tokens where the corresponding structure is missing, as same as other special tokens: '1', $\langle eos \rangle$, and $\langle pad \rangle$. We keep the loss calculation of special token '2' to teach the model where to stop. We evaluate InstructPLM on the CATH 4.2 validation set at the end of each epoch, and perform early stopping based on validation LM-loss, which can drastically reduce the training cost. As the vocabulary of InstructPLM is larger than other baselines, for fair comparison, we only calculated the perplexity on 20 valid amino acids. The perplexity on the whole vocab is shown in Supplementary Table 2. Our methods are still optimal even with a larger vocabulary. To evaluate designed sequences, we truncate each sequence between '1' and '2' from the original output of InstructPLM resulting in a sequence with pure amino acid tokens.

More Results on TS50/TS500

We further test InstructPLM on the TS50 and TS500 datasets. As Supplementary Table 3 shows, our methods are better than the best baselines by large margins.

Designed Sequences for PETase and L-MDH

As for PETase, Supplementary Table 4 and Supplementary Table 5 list the 15 designed protein sequences. Supplementary Fig. 2 shows the sequence alignment results by ENDscript [9] of PETase generated by InstructPLM, Fast-PETase [10] and wild-type PETase. As for L-MDH, Supplementary Table 6 and Supplementary Table 7 list the 15 designed protein sequences. Supplementary Fig. 4 shows the sequence

Supplementary Table 3 Sequence design performance on TS50 and TS500. The metrics include perplexity (exponentiated categorical cross-entropy loss per residue) and recovery rate (percentage of correctly predicted residues). The best performance is **bold**, while the best baseline is indicated with an underline.

Model	Perplexity ↓		Recovery ↑	
	TS50	TS500	TS50	TS500
StructGNN [5]	5.40	4.98	43.89	45.69
GraphTrans [5]	5.60	5.16	42.20	44.66
GVP [6]	4.71	4.20	44.14	49.14
GCA [7]	5.09	4.72	47.02	47.74
AlphaDesign [8]	5.25	4.93	48.36	49.23
ProteinMPNN [3]	3.93	3.53	54.43	58.08
PiFold [1]	<u>3.86</u>	<u>3.44</u>	<u>58.72</u>	<u>60.42</u>
InstructPLM (Relative Gain)	2.29 (-32.9%)	2.42 (-26.45%)	67.99 (+15.79%)	64.22 (+6.28%)

alignment results by ENDscript [9] of active L-MDH generated by InstructPLM and wild-type L-MDH. An example of L-MDH designed by InstructPLM is illustrated in Supplementary Fig. 3.

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Supplementary Table 4 Designed PETase protein sequences (1-8), ✓ indicates sequences where activity are detected; ○ denotes sequences exhibiting activity superior to the wild-type.

Protein ID	Length	Activity	Sequence
PETase-1	261	✓	PETNPYAKGPTPTAASLEASAGQFTVQSFVRVSKPIGFGAGTVVYPTDAGGRVGAIAIVPGYTTQTQAA IRWWGPRLASHGFVVMITDNTSTFDQPSRASQMLAALDQVATLNTSSPIYGVKVDTRQGVMGHS MGGGSLISAMNPNP ^{SLK} AAIPLAPWHSSTNFGVQVPTMIGAQSDTVASVSSHPIFYNSIPSTV ^{PKAY} LELLGGGHFCPNPNTTIAKYAISWMKRFVDGDTTRYDQFLCPAPSGTAISDYRTTCP SETNPYSRGPDPTRASLEASAGPFTVSSFSVSRPLGFGAGTVFYPTDAGGRVPAIAIAPGFTTQTQSSVK WWGPRLASHGFVVVTIDTNTSTFDQPSRSAQLMAALDQVSRLSQSSPIYGVKVDTRQGVMGHSMG GGSLISAQNNPDLKAAIPLAPWHTSTNFSVQVPTLIIGAENDSIAPVSTHSIPFYTSLPSTLTKAYLEL AGASHFAPNSSNTTIAKYSISWLKRFIDDDTRYEQFLCPPPPSSAISDRDTCPH METNPFHRGNPTAASLQASAGPFTVSSFRVSRPRGFGAGTVVYPTDAGGRVPAIAIVPGFTQRQSSI RWWGPM ^L ASHGFVVMITDNTSTFDQPSRSDQLMAALNQLATLNTASSPIYNKVDTRQGVMGHS MGGGSLISAQDNPNLKAALPMA ^P WNSSTNFGVTVP ^{TL} IFACQADTIAPVSSHAQPFYNSLPSTPKA YLELVGASHFAPNSSNTAIAKYAISWLKRFVDNDTRYEQFLCPPPPNSNLISEYRDTCPH GETNPYTRGPDPTVASLEASAGPYTVQSFVTSRPRGFGAGTVFYPTDAGGRVPAIAIVPGFTQRQSSV MWWGPRLASHGFVVMITDNTSTFDQPSRSAQLMAALDQVASLNSTRSPIYNKVDTRQGVMGHS MGGGSLIAAQDNPNL ^K ASAPMAPWHISTNFSAVTVPTLIVGCEGDTIAPVASHSEPFYSSLSGPEKA YLELNNASHFCPNPSPNSTNGKYAISWLKRFVDNDTRYEQFLCPPPPNSAISDYRNSCPN AETNPYTRGPDPTTASLEASAGPFTVSSFSVSRPVGFGAGTVFYPTDAGGRVGAIAIVPGFTARQSSIK WWGPRLASHGFVVMITDNTNSVFDQPSRNLQMAALNQLATLNTSSSPIYGVKVDTRQGVMGHSM GGGALIAAQDNPNL ^K AAAPLTPWHSTVNF ^{SN} VQVPTFIIGAENDTVAPVSSHAIPFYTSIPSSIPKAYM ELKGASHFAPNSSNTTIAKYSLAWLKRFDNDTRYDQFLCPPPPNSAISDYRNTCPY RETNPYSRGPDPTTASLEASAGPFTVQSFVSRPAGFGAGTVYPTDAGGRVGAIAIVPGYTTQSQSS VKWWGPRLASHGFVVMITDNTISTYDQPSRANQLAALDQVSKLNTSSPIYGVKVDTRQAVMGHS MGGGSLIAAMDNP ^{SLK} AAIPMAPWHTSTDFSGVTVP ^{TL} IFGAQNDTVAPVSSHSQPFYNSIPSTPK AYLELLGGSHFAPNSSNTAIAKYSISWLKRFVDNDTRYDQFLCPPPPNGTAISDYRSTCPH AETNPYSRGPDPTTRASLEASAGPFTVSSFSVSRPLGFGAGQVYPTDAGGKVGVAIAIVPGYTTQTQSA VKWWGPRLASHGFVVMITD ^T QSTYDQPSRATQLMAALNQIVTLNTSSSPIYNKVDTRQGVMGHS MGGGALISAMNPNLKAIPMAPWHTSTNFSNVTVP ^{TL} FIACESDSVAPVSSHAEPFYNSLPASTPKA YLELVGGGHFCPNPNTGNDSLGIMGRMTISWLKRFLDGDTRY ^{SQ} FLCGAPANSDTISDYRSTCPF METNPYVKGPDPTTASLEASAGPFTVQSFQSNRPRGFGAGVYPTDAGGRVPAIAIVPGFTQTQAS IQWWGPRLASHGFVVMITDNTNSPFDQPSRSTQLMAALNQVANLNTSSSPIYNKVDTRQGVMGHS MGGGSLIAAANNPN ^{SLK} AAALPLAPWHTSTNFSVQVPTFIMGAQNDTIAPVSSHPIFYNSLPASLPKA YMEIVGGGHLCPNPSNSGGRC ^T AGSIARYAISWLKRFLDGDTRYDQFLCPAPSGGATSDFRDTCCTY
PETase-2	262	✓	
PETase-3	263	○	
PETase-4	262	○	
PETase-5	262	✓	
PETase-6	262	○	
PETase-7	269	○	
PETase-8	269	○	

Supplementary Table 5 Designed PETase protein sequences (9-15), ✓ indicates sequences where activity are detected; ○ denotes sequences exhibiting activity superior to the wild-type.

Protein ID	Length	Activity	Sequence
PETase-9	262	○	METNPYHRGPDPTCASLEASAGPFTVRSFRVSSPLGFGAGTVYYPTDAGGRVPAIAIAPGFTQTQSSV KWWGPRLASHGFFVVMTIDTNSTFDQPDSSSQLMAALNQVSTLNSSSSPIYKVDTSRQGVMGHSM GGGSLIAAQNNPSLKAAPLAPWHSSTNFSAVTVPTLIFGAQNDTIAPVSSHIPFYNSLPSSTEKAYLE LKGASHFAPNSPNSVIKYSISWMKRFIDNTRYEQFLCPSPSSSIDYRNTCPN SETNPFSGPDPTASLEASAGPFTVSSFSVRPAGFGAGTVYYPTDAGGRVGAIAIVPGYTGTSQSSVK WWGPRLASHGFFVVMTIDTESTFDQPDSSASQLMAALDQLAVLSQRSSPIYKVDTSRQGVMGHSM GGGALISAMDNPSLKAAPLAPWHASTNFGVTVPTLIFGESDSVAPVSSHASPFYNSLPASTDKAY LELTNGGHFCPNPNTTIKYGIAWMKRFVDNDRYDQFLCPPAGSPAISQYRDTCPN GETNPFSGPNPTASLEASAGPFTVSSFSVRPLGFGAGTVYYPTDAGGRVGAIAIVPGYATQSSIR WWGPRLASHGFFVVMTIDTISTFDQPDSSSQLMAALDQLANLNSTRSSPIYKVDTRRQGVMGHSMG GGSLISAQDNPNLKAAPLTPWHASTNFSNVQVPTLIIGAENDTIAPVASHAEFPYNSLPSLSDKAYLE LNNASHFAPNSPNTTIKYSISWLKRFIDNDRYDQFLCPAPTSTAISDYRNTCPH SETNPYHRGPNPTAASLEASAGAFVSSFSVRPAGFGAGQVYYPTDAGGRVPAVAIVPGFTQTQSSV KWWGPRLASHGFFVVMTIDTNSTFDQPDSSSQLMAALNQVATLNSTASSPIYKVDTSRQGVMGHSM GGGSLISAMNPNGLKAAAAPMAPWHVSTNFSVTVPFVIGAQNDDTIAPVSSHIPFYNSLPSLPKAYI ELAGGSHFCPNPNTTIKYASISWLKRFVDNDRYDQFLCPSPSDSAISSYRSTCPNS METNPFHRGPNPTAASLEASAGPFTVQSFVRPLGFGAGTVYYPTDAGGRVPAIAIVPGYTGTSQSS VKKWWGPRLASHGFFVVMTIDTSTFDQPDSSASQLMAALNQIATLNSSASSPIYKVDTSRQGVMGHS MGGGSLISAMNPNLKAAPMAPWHISTNFSVTVPFVIGAQNDDTIAPVSSHASPFYNSLPASTPKAY LELAGASHFFPNTTNTPTFAQMIAIWFKRFLDADQRYSQFACPPPNASTLSFRNSCP AETNPYHRGPNPTASLEASAGPFTVSSFSVRPVGFGAGQVYYPTDAGGRVPAVAIVPGFTQNQGS VRWWGPMLASHGFFVVMTIDTNSTFDQPDSSASQLMAALDQVSTLNSTSSPIYKVDTSRQGVMGH SQGGGALISAQNNPNGLKAAAAPLAPWHVSTNFGVTVPTFVIAQQNDDTIAPVSTHALPFYNSLPASTP KAYLELTGGGHYCPNPNPTGLERYGIAWMKRFIDNDRYDQFLCPNNSGSSSDISRWSNRCP GETNPYTRGPNPTTASLEASAGPFTVQSFVSRPLGFGAGTVYYPTDAGGRVGAIAIVPGYTGTSQSSI RWWGPRLASHGFFVVMTIDTISTFDQPDSSNQLMAALDQLANLSQRSSPIYKVDTRRQGVMGHSM GGGSLIAAANNPNGLKAAAPLAPWHSTNFSVTVPFVIGAQNDDTIAPVSTHSIPFYNSLPSLPKAYM ELKGASHFAPNSTNSVIKYSISWLKRFVDNDRYDQFLCPPPSGTTLISDYRDNCPY
PETase-10	263	✓	
PETase-11	262	○	
PETase-12	263	○	
PETase-13	262	○	
PETase-14	264	○	
PETase-15	263	○	

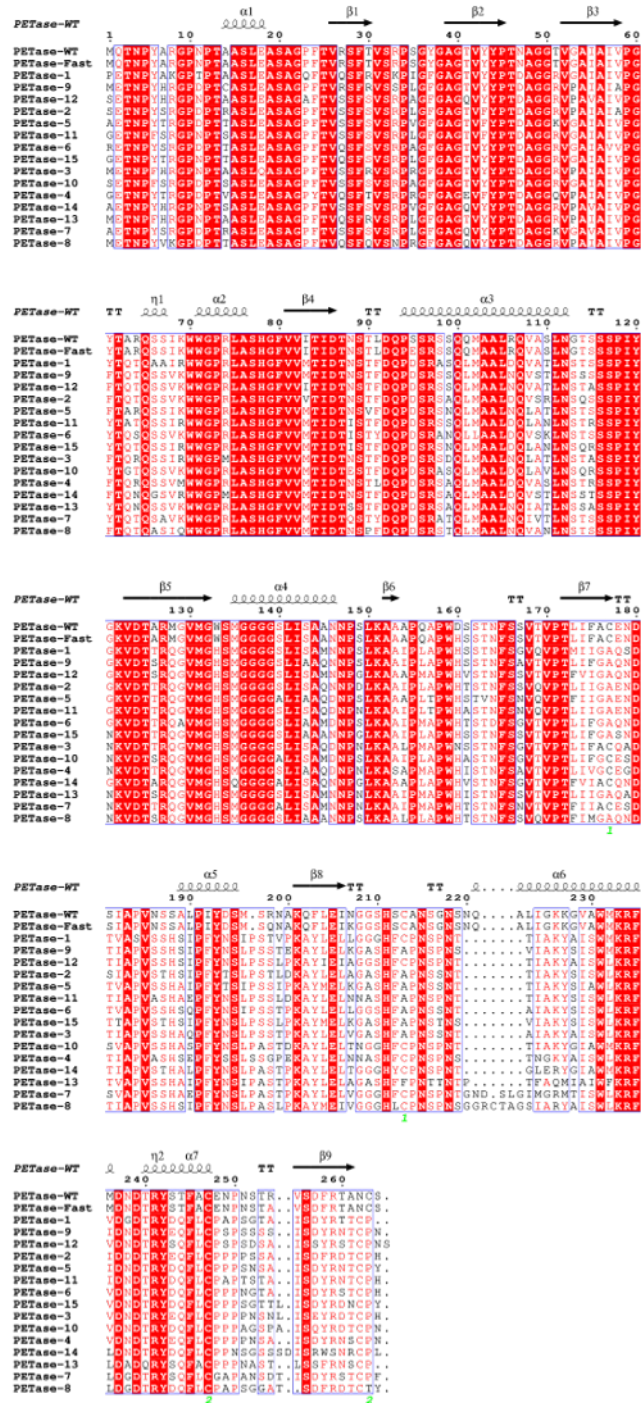
Supplementary Table 6 Designed L-MDH protein sequences (1-8), ✓ indicates sequences where activity are detected; ○ denotes sequences exhibiting activity superior to the wild-type.

Protein ID	Length	Activity	Sequence
L-MDH-1	327		MVKACVLGASGGIGVPLSLLLKQSPVLDDLALYDVVNTPGVAADLSHDSVANVAGHLPDDDDGLKKA LAGADVVIPAGVPRKPGMTRDDDLFNINASIVRDLVKGVAEYAPKAFILIISNPVNSTVPIAAEVLKAA GVFDPKRLFGVTTLDVVRAQTFTQELTGKDDPTAVIPVVGHSGETIVPLFSLVPSFPAADKLDALT KRVQYGGDEVVKAKDGAGSATLSMAYAGYRFAEKVIRALKGESVVEPTFVYLPVPGVAGGEEIAKAT GVEYFSVPVELGPNGAEKAINPLEGVTAEKKLLEAIPGLKKNIEKGVAFVQNPQ
L-MDH-2	325	✓	MVKACVLGASGGIGVPLSLLLKQSPVLDDLSLYDIANTPGVAADLSHDSVANVAGHLPKDDGLKKAL AGADVVIPAGVPRKPGMTRDDDLFNINAGIVRDLVKGVAEYAPKAFILIISNPVNSTVPIAAEVLKAA VFDPKRLFGVTTLDVVRAQTFTAEFTGQKDPSTKTPVVGHSGETIVPLFSQAKPAVNIPADKLDAL VNRVQFGDEVVKAKDGAGSATLSMAYAGYRFAESVLKALKEGKEGHEPTFVYLPVGVGGEAIAKKAT GCDFFSVPIELGPEGAEKAINPLSNVTEQEKLLLEACVEGLKKNIEKGVDFVK
L-MDH-3	326		MVKACVLGASGGIGVPLALLKNSPLVDDLSLYDVVNTPGVAADLSHDSVANVAGYLPKDDGLKKAL AGADVVIPAGVPRKPGMTRDDDLFNINAGIVRDLVKGVAEFCPKAFILIISNPVNSTVPIAAEVLKAA VFDPKRLFGVTTLDVVRAQTFTAEFTGQKDPAEVLPPVVGHSGETIVPLFSLAKPAVDIPKDKYDAL VNRVQFGDEVVKAKDGAGSATLSMAYAGYRFAEKVIRAKGESGIVEPTVYVYLPGIPGGDAIAKET GCDFFSVPIELGPDGAKKAINVIEGATAEEKLLEACIAGLKNIEKGVAFVAK
L-MDH-4	329		AVKAAVLGAAGGIGVPLSLLLKNSPLVDDLSLYDIVNTPGVAADLSHDSVANVKGHLPEDDGLKKALT GADVVIPAGVPRKPGMTRDDDLFNINASIVRDLVKGVAEYCPKAFILIISNPVNSTVPIAAEVLKAA FDPKRLFGVTTLDVVRAQTFTAEFTGQKDPKLPVVGHSGETIVPLFSLAAPSVPKIPADKLDALT NVRVQFGDEVVKAKDGAGSATLSMAFAGYRFAEVLKAIKGETGIVPTFVYLPVGVAGGDIAIAKAT GVDYFSVPVELGPNGAEKAINVADVTEKEKALLAKAIEGLKKNIEKGVAFVQNPQ
L-MDH-5	328		MVKACVLGASGGIGVPLSLKSSPLVDDLALYDIVNTPGVAADLSHDSVANVAGHLPADDDGLAKAL AGADVVIPAGVPRKPGMTRDDDLFNINAGIVRDLVKGVAEYCPKAFILIISNPVNSTVPIAAEVLKAA VFDPKRLFGVTTLDVVRAQTFTQFTGQKDPKLPVVGHSGETIVPLFSLGKPAVDIPADKLDAL TNRVQFGDEVVKAKDGAGSATLSMAYAGYRFAEKVIRAKGEAGTVVEFSVYLPVGVAGGEAIAKA TGVDFFSVVELGPNGAEKAINPLAEVTDKEKALLAKAIEGLKKNIEKGVAFVQNPQ
L-MDH-6	329		MVKAVLGAAGGIGVPLSLLLKQSPVLDELALYDVVNTPGVAADLSHSTVAKVSGHLPEDDDGLKKAL TGADVVIPAGVPRKPGMTRDDDLFNINAGIVRDLATGIAKYCPKAFVLSNPVNSTVPIVAAETLKKAG VFDPKRVFGVTTLDVVRASTFVSELTDGDKQPAKLTVPVVGHSGETIVPLISQAKPSVAIPADKLDALV NVRVQFGDEVVKAKDGAGSATLSMAYAGYRFAEKVIRAAKGESVVEPTFVYLPVGVGGEAIEQKAT GAEYFSVPVELGPNGAEKALNIVEGATEAEKKLLDAAIAGLKNIEKGVFAKNPPA
L-MDH-7	326		MVKACVLGASGGIGVPLSLLLKESPLIDELALYDIVNTPGVAADLSHDSVANVAGHLPADDDGLKKALA GADVVIPAGVPRKPGMTRDDDLFNINAGIVRDLVKGVAEYCPKAFILIISNPVNSTVPIAAEVLKAA FDPKRLFGVTTLDVVRAQTFTQFTGQKDPSTKTPVVGHSGETIVPLFSLATPAVTIPKEKYDALV NVRVQFGDEVVKAKDGAGSATLSMAYAGYRFAESVLRAIKGEKGIPTVYLPVGVPGGDAIAKETG CDFFSVVPVELGPNGAEKAINPLAGATEAEKKLLEACIPDLKKNIEKGVAFABA
L-MDH-8	329		MVKACVLGASGGIGVPLSYLLKMSPLVDDLALYDIVNTPGVAADLSHISIAKIDGHLPKDDGLKKALA GADVVIPAGVPRKPGMTRDDDLFNINAGIVRDLVKGVAEYCPKAFILIISNPVNSTVPIAAEVLKAA FDPKRLFGVTTLDVVRAQTFTQFTGQKDPSTVPIVVGHSGETIVPLFSKVEGVGSFSEDEIEKLTHR VQFGGDEVVKAKDGAGSATLSMAFAGYRFAEKVIRAKGEKGVVEPTFVYLPVGVGGEIEKKATGV DYFSVPVELGPNGAEKAVNVLGAVNEYEKLLACVAGLKNIEKGVETIKNPPPK

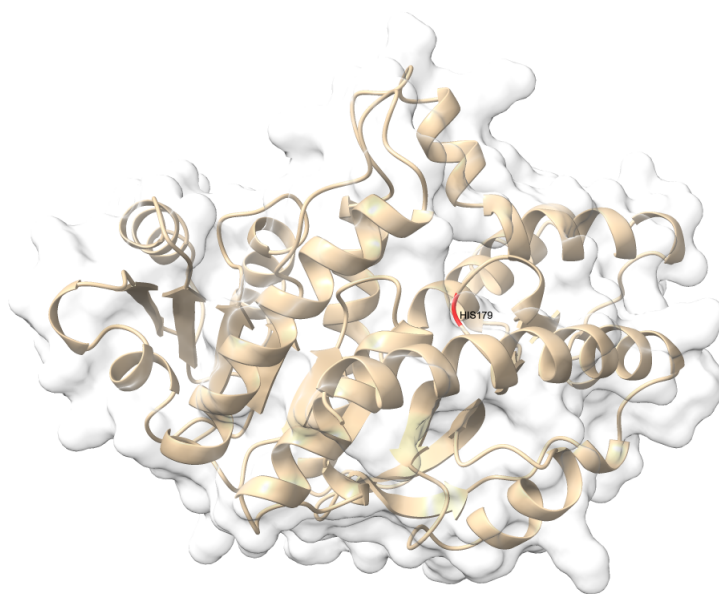
Supplementary Table 7 Designed L-MDH protein sequences (9-15), ✓ indicates sequences where activity are detected; ○ denotes sequences exhibiting activity superior to the wild-type.

Protein ID	Length	Activity	Sequence
L-MDH-9	330		MVKACVLGASGGIGVPLSWLLKQSLVDLALYDVVNTPGVAADLSHINSVAKVAGHLPPADDGLKKA LTGADVVLIPAGVPRKPGMTRDDLFNNASIVRDLVKGVAEYAPKAFILIISNPVNSTVPIAAEVLKAA GVFDPKRLFGVTTLDVVRAQTFTQFTGQKDPVVIPVIGHSGETIVPLFSKATAGVKLDPEKDLA LVNRVQFGDEVVKAKDGAGSATLSMAYAGYRFAEKVIAAKGESGVEPSVYVLPVPGVEGGEAIKKA TGVDFFSVPIELGPEGAQKAINVGNVTEAEKKLLAAIEGLKGNIAKGVFVKNPPPK MVKAVLGAAGGIGVPLSLLKTSPLVDELSLYDVVNTPGVAADLSHISTVAKVSGHLPQDDGLKKAL TGADVVIPAGVPRKPGMTRDDLFKINAGIVRDLAKGIAQHCPKAFVLISNPVNSTVPIVAEVFKKA GVFDPKRLFGVTTLDVVRASTFVSEVTGEKDPAKFKIPVVGHSQVTLPLLSQATPAVKFPKEKDLA LTNRIQFGDEVVKAKDGAGSATLSMAYAGARFANSLRAAAGEKGINVTPFVYLPVPGVEGGEAISKA TGTDFSTPVEFGPNGAEKAINVNGITPEEKLEACYAGLKGNIEKGVFVKNPPPA MVKACVLGASGGIGVPLSLLKQSLVDLSLYDVVNTPGVAADLSHISSVANVAGHLPPADDGLKKAL AGADVVIPAGVPRKPGMTRDDLFNNASIVRDLVKGVAEYCPKAFILIISNPVNSTVPIAAEVLKAAGV FDPKRLFGVTTLDVVRAQTFTAEITGQKDPASIVIPVIGHSGETIVPLFSQATPAVNLPADKLDALTK RVQFGDEVVKAKDGAGSATLSMAYAGFRFAEKVIAAKGESGVVEPSFVYLPVPGVAGGEKIAAETG VDFFSVPIELGPNGAEKAINVVEGVNEKEKALLAAVAGLKGNIAKGVAFVQNPPK MVKACVLGASGGIGVPLSLLKQSLDLDLSLYDVVNTPGVAADLSHISIANVAGHLPPADDGLKKALA GADVVIPAGVPRKPGMTRDDLFNNASIVRDLVKGVAEYAPKAFILIISNPVNSTVPIAAEVLKAAGV FDPKRLFGVTTLDVVRAQTFTAEITGQKDPASVNIPIVVGHSGETIVPLFSKAKPSVDIPADKYDALV NRVQFGDEVVKAKDGAGSATLSMAFAGFRFAEKVIAKIKGESGVVEPTFVYLPVPGVAGGEAIAKAT GVDFSPVELGAEGAAKAVNLAEANDYEKKLLAKAYEGLQGNIAKGVFIQNPVK MVKACVLGASGGIGVPLSLLKQSLVDLSLYDVVNTPGVAADLSHISSIANVAGHLPPADDGLKKAL AGADVVIPAGVPRKPGMTRDDLFNTNASIVRDLVKGVAEYAPKAFILIISNPVNSTVPIAAEVLKAAAG VDFPKRLFGVTTLDVVRAQTFTQFTGQKDPAKTIPVVGHSGETIVPLFSLGKPAVKLDADKYDA LVNRVQFGDEVVKAKDGAGSATLSMAYAGFRFAEKVIAKIKGESGLVEPTVYVLPVPGVEGGEIEKK ATGCDFFSVPIELGPNGAEKAVNVVSAATDKEKALLAKAIEGLKTNIAKGVFVKNPPA MVKAAVLGASGGIGVPLSLLKQSLDLSLYDVVNTPGVAADLSHISSVANVKGFLPKDDGLKHALA GADVVIPAGVPRKPGMTRDDLFNTNASIVRDLVKGVAEYAPKAFILIISNPVNSTVPIAAEVLKAAAG FDPKRLFGVTTLDVVRAETFTQFTGQKDPATVNIPIVVGHSGETIVPLFSKATPSVNIPIADKLDALT NRVQFGDEVVKAKDGAGSATLSMAFAGFRFAEKVIAKIKGESGVEPSVYVLPVPGVAGGDAIKKAT GCDFFSVPIELGPNGAEKAINVSEVSDKEKALLEAAVAGLKGNIEKGVAFVTSNP MVKACVLGASGGIGVPLSLLKQSLVDLALYDVVNTPGVAADLSHISSVANVKGFLPKDDGLKKAL TGADVVIPAGVPRKPGMTRDDLFNNAGIVRDLVKGVAEYCPKAFILIISNPVNSTVPIAAEVLKAAAG VFNPQRLFGVTTLDVVRAQTFTAEITGQKDPAAVPIVVGHSGETIVPLFSAKPAVSIPIQDKYDAL VNRVQFGDEVVKAKDGAGSATLSMAFAGYRFAEKVIAKAAAGEKGLIEPSFVYLPVPGVPGGEAIAKE TGVDFFSVPIELGPNGAEKAINVLSVTDDEKALLKAAIEGLKGNIAKGVFAHNPPQ
L-MDH-10	330		
L-MDH-11	329		
L-MDH-12	329		
L-MDH-13	329	✓	
L-MDH-14	328	✓	
L-MDH-15	329		

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Supplementary Fig. 2 Alignment by ENDscript [9] of PETase generated by InstructPLM, Fast-PETase[10] and Wild-type PETase. All of them (15/15) have the strictly conserved catalytic triad SER134-HIS212-ASP180. Not all sequences (4/15) have two intramolecular disulfide bridges (DS1 and DS2) and all of them (15/15) have DS2 connects the C-terminal helix and the last loop.



Supplementary Fig. 3 An example of L-MDH designed by InstructPLM, the protein structure is predicted by ESMFold. It has the same activate site HIS179 with Uniprot: A0A319AA41 which hit the UniRule PIRSR: PIRSR000102-1 [\[11\]](#).



Supplementary Fig. 4 Alignment by ENDscript [9] of L-MDH(Uniprot:A0A319AA41) and L-MDH which generate by InstructPLM and have detectable enzymatic activity. It has the same activate site HIS179 with Uniprot: A0A319AA41 which hit the UniRule PIRSR: PIRSR000102-1 [11].