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# Comparing mutagenesis and simulations as tools for identifying functionally important sequence changes for protein thermal adaptation

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Comparative studies of orthologous proteins of species evolved at different temperatures have revealed consistent patterns of temperature-related variation in thermal stabilities of structure and function. However, the precise mechanisms by which interspecific variations in sequence foster these adaptive changes remain largely unknown. Here, we compare orthologs of cytosolic malate dehydrogenase (cMDH) from marine molluscs adapted to temperatures ranging from -1.9 °C (Antarctica) to ~55 °C (South China coast) and show how amino acid usage in different regions of the enzyme (surface, intermediate depth, and protein core) varies with adaptation temperature. This eukaryotic enzyme follows some but not all of the rules established in comparisons of archaeal and bacterial proteins. To link the effects of specific amino acid substitutions with adaptive variations in enzyme thermal stability, we combined site-directed mutagenesis (SDM) and in vitro protein experimentation with in silico mutagenesis using molecular dynamics simulation (MDS) techniques. SDM and MDS methods generally but not invariably yielded common effects on protein stability. MDS analysis is shown to provide insights into how specific amino acid substitutions affect the conformational flexibilities of mobile regions (MRs) of the enzyme that are essential for binding and catalysis. Whereas these substitutions invariably lie outside of the MRs, they effectively transmit their flexibility-modulating effects to the MRs through linked interactions among surface residues. This discovery illustrates that regions of the protein surface lying outside of the site of catalysis can help establish an enzyme's thermal responses and foster evolutionary adaptation of function.

adaptation | cytosolic malate dehydrogenase | evolution | molecular dynamics simulations | protein evolution

Protein structure and function are highly sensitive to changes in temperature. Because of these thermal sensitivities, temperature has had a major influence on protein evolution: orthologs of proteins from warm-adapted species commonly show different thermal responses from orthologs of cold-adapted species (1). For example, in a recent study, we compared the thermal stabilities of structure and cofactor binding ability in orthologs of cytosolic malate dehydrogenase (cMDH) from marine molluscs adapted to temperatures ranging from ~0 °C to ~55 °C (2). Consistent temperaturecorrelated trends were observed in all measured variables: rate of heat denaturation, thermal stability of the Michaelis-Menten constant  $(K_{\rm M})$  of cofactor (NADH), and structural flexibility as indexed by in silico molecular dynamics simulation (MDS) methods. Here, in an effort to link these differences with interspecific variation in protein sequence, we extend this analysis by comparing deduced amino acid sequences of 26 cMDH orthologs from 10 genera of marine molluses adapted to an almost 60 °C range of temperatures: from -1.9 °C in McMurdo Sound, Antarctica, to ~55 °C in the rocky intertidal zone along the South China Sea (Table 1).

Our study addresses the following questions. First, at the most general level of analysis, we asked how the overall amino acid compositions (measured as percentages of different classes of amino acids) and the compositions of different regions of the

protein (surface, intermediate depth, and core) differ in relation to adaptation temperature. Second, to develop structure-function linkages, we asked what sites in the proteins are strongly conserved in all species and what sites are highly variable and, therefore, potential sites of adaptive change? Third, to test conjectures about the potential involvement of a given amino acid substitution in adaptation to temperature, we performed two types of mutagenesis experiments. One involved conventional site-directed mutagenesis (SDM) followed by enzyme isolation and in vitro characterization of protein stability (rate of heat denaturation) and function  $(K_{\rm M}^{\rm NADH})$ . The second mutagenesis technique involved MDS approaches (3). We used this in silico method to study the effects of the same substitution used in SDM on the overall structural flexibility (rmsd in backbone atom position) and residue-specific flexibility [rms fluctuation (rmsf)] of the protein. We were especially interested in determining whether the thermal responses of the mutated protein seen in vitro (SDM approach) were modified in a similar way for the protein mutated in silico. If amino acid substitutions generated by SDM and MDS consistently give similar results, then a possibility opens up for using this in silico approach to test the importance of sequence differences in a simpler manner than the more laborious approach using SDM following by enzyme isolation and in vitro characterization.

The protein we used as our study system, the cytosolic paralog of malate dehydrogenase (E.C. 1.1.1.37), is a well-characterized

### **Significance**

Comparison of 26 cytosolic malate dehydrogenase (cMDH) orthologs of marine molluscs adapted to temperatures ranging from -1.9 °C (Antarctica) to ~55 °C (South China coast) shows how amino acid usage in different regions of the enzyme varies with adaptation temperature. In vitro site-directed mutagenesis approaches and in silico molecular dynamics simulations were compared as tools for deducing functionally important sequence changes. Whereas these key amino acid substitutions invariably lie outside of the mobile regions (MRs) essential for function, they transmit their flexibility-modulating effects to the MRs through linked interactions among surface residues. Thus, regions of the protein surface lying outside of the site of catalysis can help establish an enzyme's thermal responses and foster evolutionary adaptation of function.

The authors declare no conflict of interest.

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Taxonomy			Thermal tolerance		
Family	Genus	Species	LT <sub>50</sub> (°C)	Rate of denaturation of cMDH	Refs.
Littorinidae	Echinolittorina	E. radiata	55.5	-0.0007	3 and 34
		E. malaccana	56.5	-0.0009	
	Littorina	L. keenae	47.5	-0.0033	2 and 35
		L. scutulata	45.5	-0.0043	
Lottiidae	Nipponacmea	N. fuscoviridis	44.2	-0.0028	Present study
		N. radula	42.4	-0.0054	
	Lottia	L. gigantea	37.4	-0.0059	22, 36, and 37
		L. austrodigitalis	41.1	-0.0098	
		L. scabra	_	-0.0124	
		L. digitalis	40.1	-0.0161	
		L. scutum	_	-0.0203	
		L. pelta	_	-0.0229	
Tegulidae	Chlorostoma	C. rugosa	45.0	-0.0089	2 and 38
		C. funebralis	42.5	-0.0104	
		C. brunnea	36.0	-0.0166	
		C. montereyi	36.0	-0.0239	
Neritidae	Nerita	N. yoldii	50.0	-0.0004	2
		N. albicilla	51.0	-0.0010	
Haliotidae	Haliotis	H. rufescens	—	-0.0220	39–41
		H. diversicolor	31.1	-0.0667	
		H. discus	32.3	-0.1522	
Mytilidae	Mytilus	M. trossulus	34.1	-0.0395	32, 42, 43, and present study
		M. californianus	38.2	-0.0417	
		M. galloprovincialis	37.3	-0.0602	
Laternulidae	Laternula	L. elliptica	8.3	-0.2296	44 and present study
Pectinidae	Adamussium	A. colbecki	4.0	-0.3800	

Table 1.	Taxonomy and thermal	tolerances of the study	species and the rat	e of denaturation of the
26 mollu	scan orthologs of cMDH			

Thermal tolerances indicated as the median lethal temperature (LT<sub>50</sub>). Rate of denaturation is slope of ln residual activity.

protein for which many sequences and 3D structures are available (4–7). The abundant data on cMDH allow one to study sites within the sequence that are known to be important in ligand binding, catalysis, and subunit–subunit interactions. The conformational changes essential for catalytic function are also well understood, which facilitates structure–function analyses (6). Moreover, our recent work has identified regions of the protein that are key for establishing the appropriate levels of conformational flexibility, to allow the mobile regions (MRs) of the protein to undergo the changes in conformation that are essential for ligand binding and catalysis (2, 3).

In this paper we first provide sequence information on the 26 cMDH orthologs and illustrate several trends between adaptation temperature and amino acid compositions of different regions of the protein. We then use these sequence data to develop a mechanistic analysis of structure-function relationships using SDM and MDS methods. We focus particular attention on four cMDH orthologs from two genera of littorinid snails, Echinolittorina and Littorina, whose cMDHs differ in thermal responses but have only minor differences in sequence. Through analyses of these four orthologs we show that single changes in amino acid sequence can affect thermal stability and ligand binding but that an adaptive change in thermal stability is not necessarily linked to an adaptive change in binding and vice versa. We also show that there is a type of asymmetry in amino acid substitutions between heat-stable and heat-labile orthologs. Thus, for example, replacing a residue in a heat-stable protein with the residue found in a heat-labile protein may not weaken the structure, whereas the opposite replacement may significantly enhance stability. Comparing results of SDM and MDS analyses, we show that the effects obtained through in vitro studies with SDM-generated mutant proteins are generally but not invariably reflected in the thermal responses shown in silico by MDS methods. However, MDS methods are shown to provide insights into the sites in the sequence where amino acid substitu-

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tions can lead to changes in flexibility of the mobile regions whose movements are essential for catalysis. These sites lie outside of the MR regions yet modulate their movements during function. The MDS studies thus provide evidence for involvement of many regions of the protein surface outside of the active site in modulating the stability and function of an enzyme and fostering temperatureadaptive evolutionary change.

## Results

Deduced Protein Sequences and Temperature-Related Differences in Amino Acid Compositions. In these 26 cMDH orthologs, some functionally important regions, notably in residues known to interact with cofactor and substrates, and the active site of proton acceptor function, are completely conserved (Fig. 1 and *SI Appendix*, Table S1). All of the "universally conserved residues" mentioned by Chapman et al. (6) (G14, I16, R92, R98, R161, H187, and S240 in the present study) are found in all of these molluscan orthologs. The residues involved in subunit–subunit interaction are also almost fully conserved; the only variable site in the region of subunit–subunit interaction is at site 22 (tyrosine, histidine, or leucine). High variation in sequence occurs at many other sites including those conjectured (see below) to influence the flexibility of the MRs that undergo large changes in conformation during function (e.g., the highly variable site 114).

All 26 sequences were used in an analysis of overall and regionspecific variation in amino acid composition as a function of enzyme stability, as indexed by rate of loss of activity during incubation at elevated temperature (Fig. 2). As expected, protein thermal stability was strongly correlated with the species' adaptation temperatures (Fig. 3;  $R^2 = 0.720$  and 0.866 for linear and quadratic regressions, respectively). The fractions of different categories of amino acids charged residues, weakly hydrophobic/polar residues, and hydrophobic residues—on the protein surface, at intermediate depth in

		Δ	٠	C	ΔΟ	
E.malaccana	MSEPVKVCVTGAAGQIAYSLLYSIAKGD	VFGS <mark>D</mark> QPIILTL <mark>L</mark> DIAPM	e <mark>g</mark> v <b>l</b> ngv <b>vme</b> lm <b>dc</b> am <b>pl</b> lke"	VIPTCDEKVA <b>f</b> kdi <b>daAflvgaM<b>PI</b></b>	REGMERKDLLAANIKIFK	110
E.radiata	MSE <mark>P</mark> VK <b>V</b> CV <b>TG</b> A <b>AGQIAY</b> SLLYSI <b>A</b> K <b>G</b> D	VFGS <mark>D</mark> QPIILTL <mark>L</mark> DIAPM	e <mark>s</mark> v <b>l</b> ngv <b>vme</b> lm <b>dc</b> am <b>pl</b> lke	VIPTCDEKVA <b>f</b> kdi <b>daA</b> f <b>lvgam<b>pi</b></b>	REGMERKDLLAAN IKIFK	110
L.keenae	MSEAVKVCVTGAAGQIAYSLLYSIAKGD	VFGSDQPIILTLLDIAPM	E <mark>G</mark> VLNGV <b>VME</b> LMDCAMPLLKE	VIPTCDEKVA <b>f</b> kdi <b>d</b> a <b>a</b> f <b>lvg</b> am <b>p</b> i	REGMERKDLLAANIKIFK	110
L.scutulata	MSEAVKVCVTGAAGQIAYSLLYSLAKGD	VFGSTQP11LTLPDIAPM	ECVINGVVMELMDCAMPLLKE	VIPTCDEKVAFKDIDAAFLVGAMPI	REGMERKDLLAANIKIFK	110
N. albicilia	MTDPVKVLVTGAAGQIAISLLISVARGD	VEGRUIPIILVLLDIFFM	AGVIDGVVMEMODCALPILKE	VIAIIEEAVAF DAIDAALLVGAMPI VIATTEEAVAFDKIDAAIIVGAMPI	KECMERKDILAANVKIFK	110
C. rugosa	MSEPLKVLVTGAAGOIAYSLVISIAKGD	VFGADOPVHLVLIDIPPM	KAVLDGVVMELMODCALPLLTE	TTPLVEEAPAFKDTDVACLVGAMP	KEGMERKDILLAANVKIFK	110
C.funebralis	MSDPLKVLVTGAAGQIAYSLVISIAKGD	VFGADOPVHLVLLDIPPM	KAVLDGVVMELMDCALPLLTE	ITPLVEEAPAFKDIDVACLVGAMP	KEGMERKDLLAANVKIFK	110
C.brunnea	MSEPLKVLVTGAAGQIAYSLVISIAKGD	VFGPDQPVHLVLLDIPMM	KAVLDGVVMELMDCALPLLTE	ITALVEEAPA <b>F</b> KDI <b>D</b> V <b>A</b> C <b>LVG</b> AM <b>PI</b>	KEGMERKDLLAANVKIFK	110
C.montereyi	MSEPLKVLVTGVAGQIAYSLVISIAKGD	VFGPDQPVHLVLLDIPIM	KAVLDGVVMELMDCALPLLTD	ITALVEEPPA <b>f</b> KDI <b>D</b> V <b>A</b> C <b>LVG</b> A <mark>MPI</mark>	KEGMERKDLLAANVKIFK	110
L.austrodigitalis	MSEPVKVLVTGAAGQIAYSLLYSIAKGD	VFGEKQPISLVLLDIEPM	MAVLDGVVMELQDCALPLLAD	VIPTADESAA <b>f</b> kdi <b>d</b> v <b>a</b> l <b>lvg</b> a <b>qpi</b>	RQ <b>GMERKDLL</b> K <b>AN</b> V <b>KIFK</b>	110
L.digitalis	MSEPVKVLVTGAAGQIAYSLLYSIAKGD	VFGEKQPISLVLLDIEPM	MAVLDGVVMELQDCALPLLAD	VIPTADESAA <b>f</b> KDI <b>dvA</b> L <b>LVG</b> AQ <b>PI</b>	RRQ <b>GMERKDLL</b> K <b>AN</b> V <b>KIFK</b>	110
L.gigantea	MSEPVKVLVTGAAGQIAYSLLYSIAKGD	VFGDKQPISLVLLDIEPM VFCEKODISLVLIDIEPM	MAVLDGVVMELQDCALPLLAD	VIPTADEAAAFKDIDVALLVGAOPI	ROGMERKDLLKANVKIFK	110
L.SCADIA	MOEDVKVIVTGAAGQIAISLLISIARGD	VEGEROPISEVELDIEPM	MAVIDGVVMELODCALPILAD	VIPISEEAIAF KDIDVALLVGAOP	POCMEDEDIIKAN KIFK	110
L.pelta	MSEPVKVLVTGAAGOIAYSLLYSTAKGD	VFGEROPISLVLIDIEPM	MAVIDGVVMELODCALFILAD	VIPTCDESAAFKDIDVALLVGAOPI	ROGMERKDLLKANVKIFK	110
N.fuscoviridis	MSEPVKVLVTGAAGOIAYSLLYSLAKGD	VFGEKOPISLVLLDIPPM	MAVLDGVVMELODCALPLLAG	VIPTSDEAAAFKDIDVALLVGAOP	REGMERKDLLKANVKIFK	110
N.radula	MSDPVKVLVTGAAGQIAYSLLYSIAKGD	VFGEKQPISLVLLDIPPM	MAVLDGVVMELQDCALPLLAE	VIPTADEAAA <b>F</b> KDI <b>D</b> V <b>A</b> L <b>LVG</b> AQ <b>PI</b>	RQ <b>GMERKDLL</b> K <b>AN</b> V <b>KIFK</b>	110
H.rufescens	MSEPLRVLVTGAAGQIAYSLVIAVARGE	VFGTNQPLDLLLDIKPM	EGVLNGVVMELQDCALPLLNS	VTPTCDEPVA <b>F</b> KDI <b>D</b> V <b>A</b> C <b>LVG</b> S <mark>MPH</mark>	REGMERKDLLAANVKIFK	110
H.diversicolor	MSEPLRVLVTGAAGQIAYSLVIAIARGE	VFGTNQPLDLLLDIKPM	EGVLNGVVMELQDCALPLLNS	VTPTCDESVA <b>F</b> KDI <b>D</b> V <b>A</b> C <b>LVG</b> S <mark>MPI</mark>	GE <b>GMERKDLLAAN</b> V <b>KIFK</b>	110
H.discus	MSEPLRVLVTGAAGQIAYSLVIAIARGE	VFGTNQPLDLLLDIKPM	EGVLNGVVMELQDCALPLLNS	VTPTCDESVAFKDIDVACLVGSMPH	REGMERKDLLAAN VKIFK	110
M.trossulus	MAEPLRVLVTGAAGQIAYSLLYSVAKGD	VFGPNQPIILVLLDIQPM	LGV <b>L</b> EGV <b>VME</b> MM <b>DC</b> AL <b>PL</b> LRE	VIPSVNEMEA <b>F</b> KDV <b>D</b> V <b>A</b> M <b>LVG</b> AM <b>PI</b>	REGMERKDLLAANVKIFK	110
M.callfornianus	MAEPLRVLVTGAAGQIAYSLLYSVAKGD	VEGENQPIILVLLDIQPM	LGVLEGVVMEMMDCALPLLKE	VIPSVNEMEAFKDVDVAMLVGAMPI	REGMERKDLLAANVKIFK	110
M.gallopiovincialis	MALPERVEVIGAAGQIAISEEISVARGE	VEGENOPIELVELDIGEM	EEALDCIVMETTDCALPLIKE	TIPUUVANCEKDUDUATIUCAMD	DECMERKDILAAN KIFK	108
A. colbecki	M-DPIRVVIGAAGOIAYSLLHSVAKGD	VFGENOPVELMLIDISGM	MTVLGGVVMEVMDCSLPLVRN	VVPTADPMVAFKDADVAILVGAMPI	REGMERKDLLKANVKIFK	109
	1 10 20	30 40	50 60	70 80 90	100 110	100
	1	50				
	A 0		0	*	Mobile region 1	
E.malaccana	SQGGALDTVAKKTVKVVVGNPANTNAL	ICSKYAPSIPKENFSCLT	RLDQNRAQAQIAARLGIPNSA	SNVIIWGNHSSTQFPDVRHAKAIV	NGKTVPVPEAVKDDNYLK	220
E.radiata	SQGSALDTVAKKTVKVVVGNPANTNAL	ICSKYAPSIPKENFSCLT	CLDONRAQAQIAARLGIPNSA	SNVIIWGNHSSTQFPDVRHAKAIV	NGKTVPVPEAVKDDNYLK	220
L. scutulata	SOCSALDTVAKKTVRVVVVGNPANTNAL	ICSKIAPSIPKENFSCLI	RIDONRADAOIAARIGIPNSA	SNVIIWGNHSSIQF PDVRHARAIV	NGKIVFVFEAVKDDNYSK	220
N albicilla	SOGAALDKYAKKTVKVVVGNPANTNAL	ICSKFAPSTPPENFSCI.T	RIDONRAOAOTAARAGVACSA	KNVI TWGNHSSTOY PDVNHATVET	NGKTLSVIEAIKDDSWLK	220
N.voldii	SOGMALDKYAKKTVKVVVGNPANTNAL	ICSKFAPSIPPENFSCLT	RLDONRAOAOIAARAGVACSAV	KNVVIWGNHSSTOYPDVNHATVEI	NGKTLSVFDAIKDDSWLK	220
C.rugosa	SQGNSLEKYAKKTVKVVVGNPANTNAF	IAKKY <b>A</b> PSIPAENFSCLTI	RLDONRGOAQIASRLGVPNKN	SNVI IWGNHSSTOFPDVSQAKVVI	SAGVKSVREAVGDDDWLN	220
C.funebralis	SQGNSLEKYAKKTVKVVVVGNPANTNAF	iakky <b>a</b> ps <b>i</b> paa <b>nf</b> sc <b>lti</b>	RLDQNRGQAQIASRLGVPNKNV	SNVI IWGNHSSTQFPDVSQAKVVI	STGVKSVRDAVGDDDWLN	220
C.brunnea	SQGKSLDTY <b>AKK</b> TVK <b>VVVVGNPANTNA</b> F	iakky <b>a</b> ps <b>i</b> pae <b>nf</b> sc <b>lti</b>	RLDQNRGQAQIASRLGVPNKNV	SNVI <b>IWGNHSSTQ</b> F <b>PD</b> VSQ <b>A</b> KVTI	SAGVKSVQK <b>A</b> VG <b>D</b> DDWLN	220
C.montereyi	SQGKSLDTY <b>AKK</b> TVK <b>VVVVGNPANTNA</b> F	IAKKY <b>A</b> PS <b>I</b> PAE <b>NF</b> SC <b>LT</b> I	RLDQNRGQAQIAGKLGVPNKNV	SNVI <b>IWGNHSSTQ</b> FPDVSQAKVKI	SDGVKSVQKAVGDDDWLN	220
L.austrodigitalis	SQGAALDAHAKKTVKVVVGNPANTNAL	VIAQEAPSIPKENESCLI	RLDONRAQAQVASRLGISNEN	QRTIIWGNHSSTQFPDLAHAVVHV	NGKLMPAQEAIKDDDWVK	220
L.digitalis	SOCAALDAHAKKIVAVVVVGNPANTNAL	VIAUFAPSIPAENFSCLI UTGRENDGTDRENFGCIT	CLOURAQAQVASKLGISNEN	OPTITUGNESSTOPDIAHAVVEV	NGKLMPAQEAIKDDDWVK	220
L scabra	SOGAALDAHAKKTVKVVVGNPANTNAL	VISRFAPSTPKENFSCI.TI	RIDONRAOAOVANKIGISNEN	ORTITUGNHSSTOFPDLAHAVVHV	NGKLMPAOEAIKDDNWVK	220
L.scutum	SOGAALDAHAKKTVKVVVGNPANTNAL	VIAOFAPSIPKENFSCLT	RLDONRAOAOVATKLGISNEN	ORTIINGNHSSTOFPDLAHAVVHV	NGKLMPAOEAIKDDNWVK	220
L.pelta	SQGAALDAHAKKTVKVVVVGNPANTNAL	VIAQF <b>A</b> PSIPKENFSCLTI	RLDONRAOAOVASRLGISNEN	QRTI <b>IWGNHSSTQ</b> F <b>PD</b> LAHAVVHV	NGKLMPAQE <b>A</b> IK <b>D</b> DDWVK	220
N.fuscoviridis	SQGAALDAHAKKTVKVVVGNPANTNAL	VISKFAPSIPRENFPCLT	RLDQNRAQAQVASKLGISNEN	QRTIIWGNHSSTQFPDLAHAVVHV	NGKLMPAQE <b>A</b> IK <b>D</b> DNWVK	220
N.radula	SQGAALDAHAKKTVKVVVVGNPANTNAL	VISKFAPSIPKENFSCLT	RLDQNRAQAQVASKLGISNEN	QRTI <b>IWGNHSSTQ</b> F <b>PD</b> LAHAVVHV	NGKLMPAQE <b>A</b> IK <b>D</b> DNWVK	220
H.rufescens	TQGNSLHQYAKKTVKVVVVGNPANTNAM	IRSKY <b>A</b> PS <b>I</b> PKE <b>NF</b> SC <b>LTI</b>	RLDQNRAQSQIASRVGVKVAD	RNVI <b>IWGNHSSTQ</b> FPDISQAQVKV	QDKLKDVRS <b>A</b> VQ <b>D</b> DSWLN	220
H.diversicolor	TOGNELHOYAKKTVKVVVGNPANTNAM	ICSKYAPSIPKENFSCLT	RLDONRAQSQ1ASRVGVKVAD	RNV1IWGNHSSTQFPD1SQAQVKV	QDKLKDVRSAVQDDSWLN	220
M. trossulus	IQGNSLHQIAKKIVAVVVGNPANTNAM SMCVATDSOAKKNIKUUUUCNDANTNAV	ICSKIAPSIPKENF SCLI	CLOURAQSQIASKVGVKVAD	KNOVIIWGNHSSIQFPDISQAQVKV	VCKSMPUPEAUKDDNWI N	220
M.californianus	SMGHAIDTOAKKNIKVVVGNPANTNAY	ICKKYAPSINPANFTALT	RLDONRAOAOTAAKIGVSNSS	KNCVIWGNHSSIQIPDVNORVVDI	NGKTMPVREAVKDDNWLN	220
M.galloprovincialis	SMGNAIDTOAKKNIKVVVVGNPANTNAY	ICKKY <b>A</b> PSINPANFTALT	RLDONRAOAOIAAKLGVSNSS	KNCVIWGNHSSTOYPDVNOAVVDI	NGKSMPVREAVKDDNWLN	220
L.elliptica	GQGEAINEHAKKNVKVVVGNPANTNAL	ICKKY <b>A</b> KDIPAENFTALTI	RLDONRAOAQVAERLGIPNND	WNCI <b>IWGNHSSTQ</b> Y <b>PD</b> VRA <b>A</b> TALV	NGKEVKVHEAVKDENWLK	218
A.colbecki	AQGQAMDDV <b>AKK</b> TIK <b>VVVVGNPANTNA</b> F	ICAKY <b>A</b> PS <b>I</b> PKE <b>NF</b> SA <b>LTI</b>	RLDQNRAQAQVANKLGIPCND	NNCI <b>IWGNHSSTQ</b> FPDVSYATVKV	AGKELEANS <b>A</b> IK <b>D</b> DHWVR	219
		40	.160	180190200.		
		٠				
E malagaaaa			CONCURRENT A VOT DE OT MICOL	DUDIAN KONKINGGERANDES		NO 220
E.Maiaccaña E radiata	NEFLTTVOKRGGEVIKARKLSSAMSAAK	ATADHMRDWWFGTQGDNW ATADHMRDWWFGTQGDNW	VSMGVESTGAIGIPEGIMYSY. VSMGVESTGAYCIPECIMVCV	FVRIAN-ROWRIVEGLEINDFARE PVRIAN-ROWRIVEGLEINDFARE	MDITARELOBERAMAEEIC.	NO 332
L.keenae	NEFLTTVOKRGGEVIKARKLSSAMSAAK	ATADHMRDWWFGTOGDNW	VSMGVFSTGAYGIPEGIMYSY	PVRIAN-KOWKIVEGLEINDFARE	MDLTAKELCERAMAEEIC	NO 332
L.scutulata	NEFLTTVQKRGGEVIKARKLSSAMSAAK	ATADHMRDWWFGTOGDNW	VSMGVFSTGAYGIPEGIMYSY	PVRIAN-KQWKIVEGLEINDFARE	MDLTAKELC <mark>G</mark> ERAMAEEIC	NQ 332
N.albicilla	NEFIATVQORGAAVIKARKLSSAMSAAK	AICDHMRDWWAGTPQGQW	VSMGVVSDGSYGIEKGLVYSF:	PVEIGPNHSYKIVPGLPINDFSREF	MDNTMKELIQERDMALEAC	N- 332
N.yoldii	NEFIATVQQRGAAVIKARKLSSAMSAAK	AICDHMRDWWAGTPKGQW	VSMGVVSDGSYGIEKGLVYSF:	PVEIGSNHSYKIVQGLPINDFSREF	MDNTMKELIQERDMALEAC	N- 332
C.rugosa	NAFITTVQKRGAAVIAARKLSSAMSAAK	ATCDHLRDWFMGTKEGTF	TSMGIVSDGS <b>Y</b> GIPAGLV <b>YS</b> F:	<b>p</b> vtiakdgsyki <b>v</b> qdipisdfa <b>r</b> qf	MDATKKELEEERDMACSVC	EG 333
<i>C.funebralis</i>	NAFITTVQKRGAAVIAARKLSSAMSAAK	ATCDHLRDWFMGTKEGTF	TSMGIVSDGSYGIPAGLVYSF:	PVTIAKDGSYKIVQDIAISDFARQH	MDATKKELEEERDMACSVC	EG 333
C.brunnea C.montorovi	NTFITTVQKKGAAVIAAKKLSSAMSAAK	AVCDHLRDWFMGTKEGTF	TSMGIVSDGSYNIPAGLVYSF.	PLKIAKDGSYKIVQDIAISDFARQA	MDATKKELEEERDMACSVC.	EG 333 EC 333
L austrodigitalis	NDEIKTVOTRCANVIAARKLSSAMSAAR	A CDHURDWWEGT-GERW	ISMGIUSDGSINIFAGLUISF.	PUOISTDRVVKVVPCLTISNFAR	MDATRAELEERDMACSVC.	EG 333 FA 332
L digitalis	NDFIKTVOTRGGAVIOARKI.SSAMSAAK	AICDHVRDWWFGI GERW	VSMGIISKGDYGIKEGLMYSF	PVOIGTDRVVKVVPGLTISNFARE	MDATOAELIEEKDCAFSFL	EA 332
L.gigantea	NDFIKTVQTRGGAVIQARKLSSAMSAAK	AICDHVRDWWFGT-GERW	VSMGIISKGDYGIQQGLMYSF	PVQIGTDKVVQVVPGLTISDFARE	MDATQAELVEERDCAFLFL	EA 332
L.scabra	NDFIKTVQTRGGAVIKARKLSSAMSAAK	AICDHVRDWWFGT-GERW	VSMGIISKGDYGISEGLMYSF:	<b>P</b> VQIATDRVVKV <b>V</b> PGLTISDFA <b>R</b> EF	MDVTQAELVEERDCAFSFL	EA 332
L.scutum	DEFIKTVQTRGGAVIQARKLSSAMSAAK	AICDHVRDWWFGT-GERW	VSMGIISKGD <b>Y</b> GIKEGLM <b>YS</b> F	<b>P</b> VQIGTDRVVQV <b>V</b> PGLTISNFA <b>R</b> EF	MDATQAELIEEKDCAFSFL	EA 332
L.pelta	NDFIKTVQTRGGAVIQARKLSSAMSAAK	AICDHVRDWWFGT-GERW	VSMGIISKGD <b>Y</b> GIKEGLM <b>YS</b> F	<b>P</b> VQIGTDRVVKV <b>V</b> PGLTISNFA <b>R</b> EF	MDATQAELTEEKDCAFSFL	EA 332
N.fuscoviridis	NDFIKTVQIRGGAVIQARKLSSAMSAAK	AICDHVRDWWFGT-GERW	VSMGIISKGD <b>Y</b> GIQEGLM <b>YS</b> F:	<b>P</b> VQIGTDKVVQV <b>V</b> PGLTISDFA <b>R</b> EF	MDATQAELIEERDCAFSFL	EA 332
N.radula	NDF TQTVQTRGGAVIQARKLSSAMSAAK	AICDHVRDWWFGT-GERW	VSMGIISKGDYGIQEGLMYSF	PVQIGTDKVVQVVPGLTISDFARE	LDATQAELIEERDCAFSFL	EA 332
H diversicolor	NETISTVORGAAVIAARKLSSAMSAAK	ATCDHLRDWWFGTESGTF	TOMOVIOUSIGIEAGLVYSE.	FVELAADRIIKIVQGINIDNE'AREH DVELAADRIYKIVOOINIDNEAREH	MDATRINELIEERDLAISVC.	ED 333
H.discus	NEFISTVOKRGAAVTAARKI.SSAMSAAK	AICDHLRDWWFGTESGTF	TSMGVISDGSIGIEAGLVISF.	PVETAADRTYKTVOGINIDNFARE	MDATKNELIEERDLAISVC.	ED 333
M.trossulus	NDFIKTVOORGAAVIKARKLSSAMSAAK	AIVDHVRDWWNGVPDGTY	VSMAVPSDGSYNTEEGLTYSF	PVRTKPDHTYEIVKGLTINDESRE	MDATEKELSFEKNMALSVC	ES 333
M.californianus	NEFIKTVQQRGAAVIKARKLSSAMSAAK	AIVDHVRDWWNGVPDGTY	VSMAVPSDGSYNIEEGLIYSF	PVRTKPDHTYEIVKGLTINDFSRE	MDATEKELSEEKNMALSVC	ES 333
M.galloprovincialis	NDFIKTVQORGAAVIKARKLSSAMSAAK	AIVDHVRDWWNGVPDGTY	VSMAVPSDGSYNIEEGLIYSF:	<b>P</b> VRTKPDHTYEI <b>V</b> KGLTINDFS <b>R</b> EE	MDATEKELSEEKNMALSVC	ES 333
L.elliptica	NEFIKTVQIRGAAVIKARKLSSAMSAAK	AICDHLRDWWNGTPDGRW	VSMGVISDGS <b>Y</b> GVEAGLM <b>YS</b> F	<b>P</b> VKCKADHTYEI <b>V</b> KDLDVNDFS <b>R</b> EF	MDQTQNELKDEMKMAM-EF	WW 330
A.colbecki	NDFISTVQKRGACVIAARKLSSAMSAAN	AIV <b>DHVRDW</b> WQ <b>G</b> SGDRMV	SMAVWSNDNK <b>Y</b> GIASELM <b>YS</b> F:	<b>P</b> VKTAAKGKIEI <b>V</b> NGLKIEEWQ <b>R</b> EH	RMDLTCKELVEERDAALAEC	EE 332
		50	.270	290		

Mobile region 2

Fig. 1. Deduced amino acid sequence alignments of 26 cMDH orthologs from marine molluscs. The substrate-binding sites, the cofactor binding sites, the active site proton acceptor site, and the residues involved in subunit-subunit interaction are shown in red circles, blue triangles, a green star, and orange diamonds, respectively. Conserved amino acid residues are highlighted in bold. Nonconservative replacements among *Echinolittorina malaccana*, *E. radiata*, *Littorina keenae*, and *L. scutulata* cMDHs are highlighted in red. Mobile regions (MRs) are highlighted in red frames.

the structure, and in the deep core region were calculated (Fig. 2). In the entire protein, there are significant decreases of charged residues (P < 0.001) and increases in weakly hydrophobic/polar residues (P < 0.001) with increasing protein thermal stability (Fig. 2 A and B). In the surface region, there are significant decreases of charged residues (P = 0.001) with rising thermal stability (Fig. 2D).

Total proline content of the 26 orthologs and proline abundance on the protein surface are significantly positively correlated with protein thermal stability (P = 0.030 and P = 0.029, respectively) (Fig. 2 *M* and *N*). For glycine, total content and surface content increase with thermal stability (P = 0.028 and P = 0.019, respectively) (Fig. 2 *Q* and *R*). The amino acid compositions of the

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**Fig. 2.** Overall and region-specific variation in different categories of amino acids of 26 orthologs of molluscan cMDHs as a function of enzyme stability (rate of denaturation at 40 °C for genus *Haliotis, Adamussium colbecki*, and *Laternula elliptica* and at 42.5 °C for all other species). The fitted linear regression line is shown as a solid line when P < 0.05; a dashed line is used when the regression was nonsignificant. Amino acid categories were charged (DEKR), weakly hydrophobic/polar (AGNQSTHY), and hydrophobic (LVWIFMPC) (33). (*A*–C) Overall variation in amino acid composition throughout the protein structure, (*D*–*F*) variation in surface composition, (*G*–*I*) variation in composition of the intermediate depth region, and (*J*–*L*) variation in composition of the core region of the protein. Variation in (*M*–*P*) proline and (*Q*–*T*) glycine content in different regions of the enzyme.

intermediate and core regions did not exhibit temperaturerelated trends.

Three-dimensional models of a single cMDH subunit were constructed for 6 of the 26 species to elucidate where potentially significant substitutions occurred in the folded enzyme structure and to obtain insights into how these substitutions might affect the stability and function of the enzyme (Fig. 4 and SI Appendix, Fig. S1). Of particular interest were substitutions that might affect the movements of the two MRs (structures enclosed by dashed lines in E. malaccana model) during function. Based on our previous MDS results (2), there are substantial differences among species and genera in the amount of side-chain movement in the two MRs and in how side-chain movement in the MRs responds to an increase in simulation temperature. Furthermore, a common pattern noted in comparisons of congeneric orthologs is a stronger effect of increase in temperature on one or both of the MRs in the more coldadapted species. Here we employed both in silico MDS and SDM in vitro methods to test conjectures about the possible roles of specific differences in sequence in establishing such adaptive variation in thermal sensitivity.

Dimeric assemblies of cMDHs also were constructed to optimize conditions for this structure–function analysis (Fig. 5). The residues involved in catalytic and binding functions (Fig. 1) are mostly located near or within the two highly conserved MRs (Fig. 5*A*). A principal focus of our analysis, then, was to interpret how substitutions might influence the conformational mobilities of the MRs. To this end, we focused on the orthologs from congeners of two genera of littorinid snails, *E. malaccana, E. radiata, L. keenae*, and *L. scutulata* (Fig. 5*B*). There are only seven nonconservative amino acid substitutions among these four orthologs (residues 4, 33, 41,

48, 114, 219, and 321), and this high degree of sequence similarity makes these four orthologs a tractable study system to examine the importance of specific amino acid substitutions on the enzymes' thermal sensitivities. The nonconservative substitutions among *Echinolittorina* and *Littorina* cMDHs mainly occur near (but not within) the MR sites in the individual subunit or in regions of the subunit that, in the dimer, lie near the other subunit's MRs. Thus, these variable sites could be important in affecting the structural



**Fig. 3.** Relationship between median lethal temperature ( $LT_{50}$ ) and the rate of denaturation (slope of ln residual activity) of cMDH orthologs from marine molluscs. Each point represents the  $LT_{50}$  from one species. Regression coefficients are Y = 0.00603\*X - 0.279,  $R^2$  = 0.720 (linear regression), and Y = -0.391 + 0.0155\*X - 0.000154\*X<sup>2</sup>,  $R^2$  = 0.866 (quadratic regression).



**Fig. 4.** Three-dimensional models of a single cMDH monomer from *Echinolittorina malaccana*, *E. radiata*, *Lottia austrodigitalis*, *L. digitalis*, *Chlorostoma funebralis*, and *C. montereyi*. Red-colored ribbons identify the regions in which the increase in simulation temperature led to a significant change in structural movements [indexed by a change in rms fluctuation (rmsf) over the equilibration state (10–20 ns) greater than 0.5 Å]. Simulation temperatures were 15 °C and 57 °C for the genus *Echinolittorina* and 15 °C and 42 °C for the other orthologs (2). The locations of the two mobile regions are shown by dashed lines in *E. malaccana* cMDH monomer. The variable sites between species within each genus are indicated by yellow spheres.

stability of both monomer and dimer. Intergeneric differences between *E. malaccana* and *L. keenae* cMDHs are only found at sites 4 and 114. Residue 4 is close to the residues involved in subunitsubunit interactions, where a proline occurs in the *Echinolittorina* cMDHs and alanine is found in the two *Littorina* orthologs (Figs. 1 and 5). For the *Chlorostoma* orthologs, where interspecific differences in sequence are greater than for the other two genera, the sites of nonconservative sequence differences again are found outside of—yet in close proximity to—the mobile regions (Fig. 4).

In Silico Analysis: Global and Localized Flexibility of cMDH Orthologs in Wild-Type and Mutant Enzymes. To link changes in sequence with temperature-adaptive alterations in stability and function, we first used MDS methods to analyze the overall flexibility of the backbone atoms of selected orthologs (rmsd analysis) and the movements of each individual side-chain in the sequence (rmsf analysis). The predicted stabilities obtained from these in silico analyses were then compared with results of subsequent in vitro studies using variants obtained by SDM methods.

To investigate the roles of site 4 and site 114 in establishing the structural stability of the cMDH orthologs, we performed rmsd and rmsf analyses of three wild-type cMDHs [E. malaccana (wt-Em), E. radiata (wt-Er), and L. keenae (wt-Lk)] and four mutant cMDHs (mut-G114S, glycine mutated to serine at site 114 for the E. malaccana ortholog; mut-P4A, proline mutated to alanine at site 4 for the E. malaccana ortholog; mut-S114G, serine mutated to glycine for the E. radiata ortholog; and mut-A4P, alanine mutated to proline for the L. keenae ortholog) (SI Appendix, Figs. S2 and S3 and Tables S2 and S3). There was no significant difference in rmsd values of backbone atom movement between mut-G114S and the wild-type ortholog of E. malaccana at 57 °C (Fig. 6A). However, there were significantly different (P < 0.05) rmsd values of backbone atom movements in other cases: rmsd values of mut-S114G were higher compared with wt-Er (Fig. 6 B and C), wt-Em (Fig. 6 A-C), and mut-G114S (Fig. 6A-C) orthologs at a simulation temperature of 57 °C. The equilibrium (10-20 ns) rmsd value of mut-S114G was approximately equal to 2.7 Å, compared with 2.1 Å for wt-*Em*, 2.0 Å for mut-G114S, and 2.2 Å for wt-*Er* orthologs, indicating that the mutation from serine to glycine at site 114 significantly decreased thermal stability of the E. radiata ortholog. Replacing the alanine at site 4 with proline for the L. keenae ortholog (mut-A4P) significantly increased thermal stability, as indicated by the decrease in rmsd value of backbone atoms (Fig. 6 D-F). However, changing the proline at position 4 to an alanine in the E. malaccana ortholog (mut-P4A) did not change the rmsd value (Fig. 6 D-F).

The rmsf results showed that in silico mutations had divergent effects on the residue-specific structural flexibility at a simulation temperature of 57 °C (Fig. 7). Compared with the wild-type E. malaccana cMDH (wt-Em), mut-G114S exhibited no major changes in structural flexibility across the sequence; the two spectra were essentially superimposed (Fig. 7A). However, compared with the E. radiata wild type (wt-Er), mut-S114G led to higher rmsf values around residues 45-55, indicating increased flexibility in this region as a consequence of replacing the serine with a glycine residue (Fig. 7B). The two spectra were otherwise very similar, notably in the two MRs. The proline to alanine mutation at site 4 (mut-P4A) induced an increased flexibility around residues 20-35 compared with wt-Em (Fig. 6C); a slight change in the specific residues showing maximal flexibility in MR1 (residues 90-105); and higher flexibility in residues 214-222, which lie just outside of MR2 (residues 230-245). In contrast to these effects seen with mut-P4A, when alanine is replaced by proline at site 4 for the L. keenae ortholog, lower



**Fig. 5.** Dimeric assembly of *Echinolittorina malaccana* cMDH. (A) The substrate-binding sites, the cofactor binding sites, the active site proton acceptor, and the residues involved in subunit-subunit interaction are shown in red, blue, mauve, and yellow spheres, respectively. The locations of the two mobile regions (residues 90–105 for MR1 and residues 230–245 for MR2) are highlighted by red shading. (B) Nonconservative replacements among *E. malaccana*, *E. radiata*, *Littorina keenae*, and *L. scutulata* cMDHs are shown in cyan spheres (residues 4, 33, 41, 48, 114, 219, and 321). The locations of the two MRs are shown by red dashed lines.



**Fig. 6.** The rmsd of backbone atom positions for cMDHs at a simulation temperature of 57 °C. (*A* and *B*) Two wild-type cMDHs, *Echinolittorina malaccana* (wt-*Em*) and *E. radiata* (wt-*Er*), and two mutant forms, mut-G114S (glycine mutated to serine at site 114 for the *E. malaccana* ortholog) and mut-S114G (serine mutated to glycine for the *E. radiata* ortholog). (*C*) The corresponding equilibrium rmsd values (10–20 ns as shaded) (n = 10) and statistical analyses. (*D* and *E*) Two wild-type enzymes, wt-*Em* and *Littorina keenae* (wt-*Lk*), and two mutant enzymes, mut-P4A (proline mutated to proline for *L. keenae* ortholog). (*F*) The corresponding equilibrium rmsd values (n = 5) and statistical analysis. Data are expressed as means  $\pm$  SEM, and significance is denoted with asterisks: \*P < 0.05, \*\*P < 0.01, and \*\*\*P < 0.001.

rmsf values occur around residues 45–55 (Fig. 7D), indicating a less flexible structure in this region.

In Vitro Analysis: K<sub>M</sub><sup>NADH</sup> and Heat Denaturation of cMDH Orthologs in Recombinant Wild-Type and Mutant Enzymes. To determine if the MDS results reflect the properties of the enzymes measured in vitro, three recombinant wild types [E. malaccana (wt-Em), E. radiata (wt-Er), and L. keenae (wt-Lk)], and four mutant enzymes [mut-G114S and mut-P4A (corresponding to E. malaccana cMDH), mut-S114G (corresponding to the E. radiata ortholog), and mut-A4P (corresponding to *L. keenae* ortholog)] were constructed for measurements of  $K_{\rm M}^{\rm NADH}$  and thermal stability (see SI Appendix, Table S4, for statistical results). Significant effects on thermal stability of cofactor (NADH) binding were revealed for some of the mutant enzymes. The  $K_{\rm M}^{\rm NADH}$  value of mut-G114S was significantly higher than that of wt-Em at 25°, 30°, 35°, and 40 °C (P = 0.033, P = 0.029, P < 0.001, and P < 0.001, respectively) (Fig. 8A), indicative of a stronger perturbation by temperature of the mut-G114S enzyme. Similarly, compared with wt-*Er*, mut-S114G had higher  $K_{\rm M}^{\rm NADH}$  values at measurement temperatures of 30 °C and 35 °C (P = 0.049 and 0.010, respectively). Across the full range of experimental tempera-tures, the slope of the relationship between  $K_{\rm M}^{\rm NADH}$  and measurement temperature for wt-Em was significantly lower than those of mut-G114S, wt-Er, and mut-S114G, further indicating that the wild-type E. malaccana ortholog has the highest thermal stability in cofactor binding (P = 0.017, P = 0.002, and P < 0.001, respectively) (Fig. 8A, Inset).

Mutations that exchanged proline and alanine residues also revealed significant effects on kinetics: The  $K_{\rm M}^{\rm NADH}$  value of mut-P4A cMDH was significantly higher than that of wt-*Em* at all temperatures (P < 0.05), indicating that mutagenesis from proline to alanine at position 4 for the *E. malaccana* ortholog decreased ligand binding ability (Fig. 8*B*). A significant difference in the slope of the  $K_{\rm M}^{\rm NADH}$  versus temperature relationship also was observed between wt-*Em* and mut-P4A orthologs (P =0.018) (Fig. 8*B*, *Inset*). In contrast to the effects observed with the mut-P4A substitution, the  $K_{\rm M}^{\rm NADH}$  value of mut-A4P showed no significant difference from that of wt-*Lk*, indicating this mutation does not change ligand binding ability (Fig. 8*B*).

Thermal denaturation at 57.5 °C of recombinants wt-*Em*, wt-*Er*, wt-*Lk*, and the mutants mut-G114S, mut-S114G, mut-P4A, and mut-A4P revealed the relative importance of different residues at

sites 4 and 114 on thermal stability (Fig. 9). Mutagenesis from glycine to serine at position 114 (mut-G114S) for the *E. malaccana* ortholog did not change the rate of loss of activity (Fig. 9A). In contrast, changing serine to glycine in the *E. radiata* enzyme (mut-S114G) led to a significant decrease in thermal stability (Fig. 9A). The slope of the regression of residual activity as a function of incubation time of mut-S114G was significantly steeper than the slopes of wt-*Em*, wt-*Er*, and mut-G114S orthologs, indicating that the substitution of serine for glycine in the *E. radiata* ortholog can dramatically reduce the enzyme's thermal stability (P < 0.001, P < 0.001, and P = 0.002, respectively) (Fig. 9A, *Inset*).

Proline at site 4 is very important for the thermal stability of *E.* malaccana and *L. keenae* cMDHs (Fig. 9B). When this proline is replaced by an alanine for *E. malaccana*, the thermal stability significantly decreased at 57.5 °C (wt-*Em* vs. mut-P4A) (P < 0.001) (Fig. 9B, *Inset*). For *L. keenae*, thermal stability of the mutated ortholog in which alanine is replaced by a proline (mut-A4P) is significantly increased compared with the wild type (wt-*Lk*) (P = 0.031) (Fig. 9B).

#### Discussion

In general, warm-adapted proteins are characterized by an enhanced global conformational rigidity, whereas cold-adapted proteins usually exhibit a relatively high flexibility (2, 8, 9). Previous studies that have sought to identify broad trends in temperature-related variation in amino acid composition and sequence that could explain these trends have focused primarily on proteins of archaeal and bacterial species whose optimal growth temperatures (OGT) spanned a range of over 100 °C (10). To our knowledge, no previous study of eukaryotic proteins has sampled orthologs from organisms with the wide range of adaptation temperatures, almost 60 °C, found in the present study of marine molluses. Thus, our data allow generalizations about temperature-related amino acid compositions of orthologs of an enzyme from eukaryotes with body temperatures that span almost the full range of eukaryotic body temperatures (1) and also permit comparisons between trends found in eukaryotic and bacterialarchaeal proteins. Our data also provide a platform for designing mutagenesis studies to test the importance of specific substitutions on structural and functional thermal stability.

At the descriptive level, our data reveal patterns of temperaturerelated differences in fractional contributions of different classes of amino acids in specific regions of the protein and identify



**Fig. 7.** The rms fluctuation (rmsf) for individual residues over the equilibration state (10–20 ns) of cMDHs at a simulation temperature of 57 °C. (*A* and *B*) Two wild-type enzymes, *Echinolittorina malaccana* (wt-*Em*) and *E. radiata* (wt-*Er*), and two mutant enzymes, mut-G114S (glycine mutated to serine at site 114 for the *E. malaccana* ortholog) and mut-S114G (serine mutated to glycine for the *E. radiata* ortholog) (*n* = 10). (C and *D*) Two wild-type enzymes, wt-*Em* and *Littorina keenae* (wt-*Lk*), and two mutant enzymes, mut-P4A (proline mutated to alanine at site 4 for the *E. malaccana* ortholog) and mut-A4P (alanine mutated to proline for the *L. keenae* ortholog) (*n* = 5). The locations of the two mobile regions (residues 90–105 for MR1 and residues 230–245 for MR2) are highlighted by gray shading.



Fig. 8. Temperature dependence of the Michaelis-Menten constant for cofactor (reduced nicotinamide adenine dinucleotide) ( $K_{M}^{NADH}$ ) for recombinant wild-type and mutated cMDHs. (A) Two recombinant wild types, Echinolittorina malaccana (wt-Em) and E. radiata (wt-Er), and two mutants, mut-G114S (glycine mutated to serine at site 114 for the E. malaccana ortholog) and mut-S114G (serine mutated to glycine for the E. radiata ortholog). (Inset) Arrhenius plot (In  $K_{\rm M}^{\rm NADH}$  versus reciprocal temperatures in kelvin) of cMDHs. (B) Two recombinant wild types, wt-Em and Littorina keenae (wt-Lk), and two mutants, mut-P4A (proline mutated to alanine at site 4 for E. malaccana ortholog) and mut-A4P (alanine mutated to proline for L. keenae ortholog). (Inset) Arrhenius plot (In  $K_{M}^{NADH}$  versus reciprocal temperatures in kelvin) of cMDHs. Data are expressed as means  $\pm$  SEM (n = 5).

temperature-related changes in two amino acids, proline and glycine, that are likely to be of special significance in modulating thermal sensitivity. At the mechanistic level, where we analyze how specific substitutions exert their effects on thermal sensitivity of structure and function, we show that mobile regions, whose sequences are highly conserved, play a critical role in adaptation to temperature. Thus, substitutions that modify the energy barriers to movement of MRs appear to be of central importance in adaptation. These substitutions lie outside of the MRs and have their effects transmitted to the MRs through concerted interactions across the protein surface. In addition to intrasubunit effects, the sites that affect subunit-subunit interaction can also affect the stability of dimers. Thus, for multisubunit proteins, it is necessary to take into account multimeric effects to understand fully the process of thermal adaptation.

Amino Acid Usage and Adaptation Temperature. Several significant trends between enzyme thermal stability and amino acid usage were revealed in this study (Fig. 2). These trends include a negative correlation between thermal stability and the percentage contributions of charged amino acids to the entire protein structure and to the protein surface (Fig. 2A and D). The overall content of weakly hydrophobic and polar residues was significantly higher in warm-adapted orthologs, but no significant trends in individual protein regions were observed (Fig. 2 B-K). We also show that the frequency of occurrence of proline and glycine in the entire enzyme and on the protein surface correlated positively with adaptation temperature (Fig. 2 M, N, O, and R). The importance of surface-localized substitutions has been shown in other studies as well (4, 11–13); we discuss below how these surface changes can cause different thermal sensitivities in structure and function.

The trends in amino acid usage found in this study contrast with some of the patterns previously observed in bacterial and archaeal proteins. Thus, in contrast to our findings, proteins of thermophilic bacteria were shown to display a bias in amino acid composition in which charged residues are present in relatively large numbers and polar residues are relatively scarce (14). The broadest analysis of microbial proteins involved comparisons of proteomes of bacteria and archaea with OGTs from 8 °C to  $\sim 100$  °C (10). This study revealed the following significant trends: total protein-wide contributions of charged and hydrophobic residues increased and those of polar residues decreased

with rising OGT. In surface regions and intermediate interior regions of structure (between surface and core) these same patterns were observed. However, the deep core of the proteins did not mirror these patterns.

Trends in the frequency of occurrence of glycine and proline merit close consideration in the context of providing a mechanistic explanation of temperature-adaptive change. Glycine content (Fig. 2 Q-T) did not follow the previously reported trend of increasing in cold-adapted orthologs (15, 16); rather, in the cMDHs, glycine content on the surface region was positively correlated with adaptation temperature. This trend is especially evident in orthologs of *Echinolittorina* congeners. The ortholog of the more heat-adapted species, E. malaccana, had glycines in two positions (48 and 114) occupied by serines in the cMDH of its congener, E. radiata (Figs. 1 and 3); these were the only differences in sequences between the two species. Hence, the replacement of two serines with glycines, which in principle would be expected to decrease stability due to the enhanced flexibility of structure associated with glycine residues (17), has led to an increase in stability instead. We conjecture that the surfacelocalized glycines in heat-adapted orthologs, for example, that of E. malaccana, may facilitate organization of the folded structure into a more compact and temperature-resistant protein because of the small size of a glycyl residue. Thus, adaptive changes in localized regions of a protein may involve amino acid substitutions that disobey the canonical rules developed from analysis of entire proteomes.

The significant temperature-related trend in proline content observed for the 26 cMDH orthologs may account, at least in part, for the differences in resistance to heat denaturation and to structural perturbations that disrupt ligand binding. Thus, the relatively high rigidity in structure at and around proline residues may be important in reducing thermal sensitivity of protein conformation (17). Positive correlations between proline content and adaptation temperature have been reported in other studies (4, 18–21). A key role for proline in modulating thermal stability is suggested for cMDHs of two species of littorinid snails belonging to the genera Echinolittorina (E. malaccana) and Littorina (L. keenae); both species have relatively high upper thermal limits (57 °C and 48 °C, respectively; Table 1). The only two differences in amino acid sequences for cMDH orthologs of these two species occurred at sites 4 and 114: proline (site 4) and





Fig. 9. Thermal stabilities of recombinant and wild-type cMDH determined as the residual activities following incubation at 57.5 °C for different times. (A) Two recombinant wild types, Echinolittorina malaccana (wt-Em) and E. radiata (wt-Er), and two mutants, mut-G114S (glycine mutated to serine at site 114 for the E. malaccana ortholog) and mut-S114G (serine mutated to glycine for the E. radiata ortholog). (Inset) Slope of the linear regression of In residual activity. (B) Two recombinant wild types, wt-Em and Littorina keenae (wt-Lk), and two mutants, mut-P4A (proline mutated to alanine at site 4 for the E. malaccana ortholog) and mut-A4P (alanine mutated to proline for the L. keenae ortholog). (Inset) Slope of the linear regression of In residual activity. Significance denoted with asterisks: \*P < 0.05, \*\*P < 0.01, and \*\*\*P < 0.001. Data are expressed as means  $\pm$  SEM (n = 3).

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glycine (site 114) for *E. malaccana* and alanine residues at both positions for *L. keenae*. The importance of proline's stabilizing effects was shown in the studies employing SDM and MDS approaches, as discussed below.

Linking Sequence Variation to Thermal Stability of Structure and Function. To test conjectures about the roles of specific amino acid substitutions on structural stability and thermal sensitivity of cofactor binding, we conducted parallel in silico and in vitro studies on selected orthologs. These experiments focused on the two mobile regions, MR1 and MR2 (Fig. 4), which comprise residues 90-105 and 230-245, respectively (Fig. 1). We concentrated on MR1 and MR2 because of their pivotal roles in binding and catalysis and the occurrence of significant interortholog differences in their thermal sensitivities (2) despite a high degree of sequence conservation in both MRs (Fig. 1). As shown in Fig. 7, these two regions exhibit the highest rmsf values in the cMDH sequence. The magnitude of rmsf values in the MRs is commonly although not invariably lower in orthologs of more warmadapted congeners (compare values for E. malaccana and E. radiata) (Fig. 7 A and B). Furthermore, the effects of increases in simulation temperature on rmsf values in the MRs are lower in warm-adapted than cold-adapted orthologs (2).

Identifying the specific amino acid substitutions that are responsible for the interortholog differences in flexibility in MR1 and MR2 can be made with varying degrees of confidence. The clearest cause-effect linkage is for the two congeners of Lottia, whose cMDHs differ by only a single substitution: at position 291, the serine in the ortholog of the more heat-tolerant species, L. austrodigitalis, is replaced by a glycine in the ortholog of L. digitalis (Fig. 4) (22). Despite this minor variation in sequence, the number of residues in the MRs that show a change in rmsf in response to an increase in simulation temperature is smaller in L. austrodigitalis than in L. digitalis (table 1 in ref. 2). Even though site 291 falls well outside of MR1 and MR2, it appears to affect the temperature sensitivity (as indexed by the change in rmsf) of both mobile regions, as well as movement of backbone structures throughout the protein, as indexed by rmsd (2). A similar pattern was observed between the cMDHs of the two congeners of Echinolittorina: the only two amino acid substitutions reside outside of the MRs yet they influence the flexibility of the MRs and account for the variable thermal sensitivities of structure and cofactor binding between orthologs (3). We conjecture that the sites of this variation lie largely in regions of the sequence that influence the conformational stabilities of the MRs themselves and/or the energy changes that occur during formation of the ternary complex, notably the collapse of the catalytic loop during cofactor binding.

Previous studies have reached similar conclusions about the functionally important roles of substitutions at sites distant from active sites. For example, a study on a-amylase from an Antarctic bacterium pointed out the importance of effects on protein flexibility induced by amino acid substitutions at sites distant from the active site and substrate binding groove (12). Comparable effects of amino acid substitutions at positions distant from the active site have been found in studies of solute effects on proteins. Studies of adaptive evolution of a fish hatching enzyme, high choriolytic enzyme (HCE), showed that a single amino acid substitution results in differential salt dependency of orthologs of this enzyme. Superimposition of killifish HCEs with the 3D structure model of medaka HCE revealed that the single substitution was located on the surface of HCE molecule, far from its active site cleft (23). In summary, all of these findings provide support for the importance of effects of transmitted conformational effects through large regions of the protein, in keeping with the analysis of Gerstein and Chothia (24) and others (25).

Whereas we have focused up to this point on structure-function effects seen at the level of the single subunit, certain of the substitutions we have found may influence the interactions between the two subunits of the cMDH dimer and alter the thermal sensitivity of the dimeric enzyme. Sequences of the subunit contact sites themselves do not show evidence for adaptive change (Fig. 1): the only sequence variation in the region of subunit–subunit interaction is at site 22 (tyrosine, histidine, or leucine). Our data again contrast with studies of microorganisms. Studies of thermophilic bacteria (5, 26) have proposed that the presence of increased numbers of charged residues at subunit contact sites fosters formation of additional ionic interactions across the dimer–dimer interface, which favors stability of the enzyme dimer (5). In an MDH from a thermophilic bacterium, the number of charged residues involved in stabilizing subunit– subunit interactions was higher than in cMDH from a mammal (5). These differences were conjectured to contribute to elevated thermal stability of the bacterial enzyme.

In our comparisons of warm- and cold-adapted cMDH orthologs, the conservative changes at site 22 would not lead directly to differences in ionic interactions for stabilizing the dimer. Thus, within the species of molluscs we examined, the observed differences in global thermal stability are likely not due to different strengths of intersubunit interactions that arise from the amino acids present at the subunit-subunit interaction sites. However, the possibility remains that the strengths of these interactions could be influenced by differences in conformational stability of the subunits. These differences could arise from amino acid substitutions distant from subunit interaction sites yet which lead to stabilization of the dimer. These transmitted effects, wherein changes at sites distant from the site at which functionally important effects occur (here stabilization of subunit-subunit interactions), may thus pertain for stabilizing the dimer as well as for stabilizing ligand binding. A conceptual framework for evaluating these types of transmitted effects has been developed for an enzyme closely related to MDH, lactate dehydrogenase (24). In this model, the protein can be regarded as comprising "concentric shells of increasing mobility" (core to surface), with large conformational changes in surface regions being transmitted throughout much and perhaps all of the molecule (24). Temperature-induced conformational changes in relatively flexible surface regions of a protein thus could be transmitted to sites involved in subunit interactions, as well as to catalytic sites. Influences on the mobilities of MRs could be critical in both types of effects. This model can account for the findings that amino acid substitutions that affect thermal stability of the protein and its catalytic function (indexed by  $K_{\rm M}^{\rm NADH}$ ) occur distant from the enzyme's active site and the subunit-subunit interface region.

How Do the Findings of in Silico and in Vitro Analyses Compare? One of the purposes of this study was to determine whether mutagenesis involving SDM methods, followed by in vitro study of the overexpressed protein, and in silico methods using MDS led to similar conclusions about the role of specific amino acid residues in establishing protein thermal sensitivity. As shown by data in Figs. 6-9, agreements between these two methods were found in some but not all comparisons. For example, the mutation induced at site 4 in the cMDH of L. keenae-the replacement of an alanine by a proline, mut-A4P-led to a decrease in rmsd (Fig. 6E), reflecting increased backbone rigidity and a decrease in rate of denaturation in vitro (Fig. 9B). In contrast to this consistency between the in silico and in vitro approaches, the replacement of the proline residue found at site 4 in the E. malaccana ortholog with an alanine did not lead to significant change in rmsd (Fig. 6D) even though the in vitro thermal stability of the enzyme (mut-P4A) significantly decreased relative to recombinant wild-type enzyme (wt-Em) (Fig. 9B). The results of the rmsf analyses (Fig. 7) may provide some insights into these disparate results. In the case of the wt-Lk versus mut-A4P comparison (Fig. 7D) the mobility of residues near site 50 in the sequence was greatly reduced in the more stable mut-A4P variant of the enzyme. This region lies near the other subunit's MR2 in the dimer, so the alanine to proline change might lead to improved monomer-monomer contacts in the dimer as well as to effects on the mobility of MR2. Thus, it seems possible that the conformational flexibility of the region near site 50 could be

critical in governing the thermal responses of the native dimeric protein. Shifts in the rmsf values of residues in MR1 are also seen, especially in residues near sites 95–100. In the comparison of wt-*Em* and mut-P4A, a large number of residues throughout the sequence exhibited shifts in rmsf value (Fig. 7*C*). However, how these changes in flexibility translate into a decrease in thermal stability cannot be determined with confidence.

In the cMDHs of the two *Echinolittorina* congeners, consistencies and inconsistencies were again found between in silico and SDM in vitro studies that involved mutations at site 114. There was again a type of asymmetry in the observed changes. Thus, for the ortholog of E. malaccana, replacing the glycine residue at site 114 with a serine (wt-Em to mut-G114S) did not cause a change in rmsd (Fig. 6A) or alter thermal sensitivity in vitro (Fig. 9A). However, doing the opposite mutation in the ortholog of E. radiata—replacing the serine with a glycine (wt-Er to mut-S114G)—significantly increased rmsd (Fig. 6B) and the rate of loss of activity during heating (Fig. 9A). A correlate of these effects on rmsd and in vitro stability is seen in the rmsf data (Fig. 7). The thermally sensitive mut-S114G enzyme exhibits a large increase in residue mobility near sites 45–50, the region of sequence that showed a large decrease in mobility in the mut-A4P enzyme, which had enhanced in vitro stability (Fig. 9B).

A further comparison of relevance contrasts the effects of mutations on in vitro thermal stability (Fig. 9) and ligand binding  $(K_{\rm M}^{\rm NADH})$  (Fig. 8). In some cases, a change in resistance to thermal denaturation was accompanied by altered thermal perturbation of binding. For example, mut-P4A showed greater thermal sensitivity in binding as well as reduced protein stability relative to wt-*Em*. A similar agreement was seen for the comparison of wt-*Er* and mut-S114G. However, whereas wt-*Em* and mut-G114S showed no difference in thermal stability of structure, a significantly increased sensitivity of  $K_{\rm M}^{\rm NADH}$  was found in the mut-G114S variant. The uncoupling of effects on structure and binding seen in the latter case indicates that a mutation that alters temperature sensitivity of enzyme-ligand interactions need not alter the global stability of the protein.

In summary, it is noteworthy that the results of the MDS experiments mirror the trends of SDM in vitro studies only in part. As emphasized in a recent review, simulation methods may fall short of in vitro methods in certain instances due largely to current limitations in in silico algorithms (27). In the present study, the differences between the in silico and in vitro analyses in thermal sensitivity of the different variants of cMDH may be a consequence of a focus on the monomer in the in silico studies and the use of a dimeric enzyme in the in vitro work. Thus, amino acid substitutions that affect the stability of the dimer would not necessarily lead to changes in, for example, the computed rmsf values of a simulated monomer. Further parallel use of these in silico and SDM in vitro approaches are needed, to allow a more comprehensive analysis of the potential utility of MDS methods for testing putative adaptive significance of amino acid substitutions. At the very least, however, MDS methods are helpful in identifying sites in the protein sequence where changes in conformational flexibility are induced by an amino acid substitution. The present studies illustrate this contribution of MDS approaches and show how the identification of the sites of changes in conformational flexibility leads to a deeper understanding of how regions of surface structure distant to protein active sites can contribute to the functional properties of the protein. Combined studies using both in silico MDS methods and in vitro site-directed mutagenesis thus can provide a clearer understanding of thermal adaptation of proteins and protein structure-function relationships in general.

#### **Materials and Methods**

Sequencing of cMDH cDNA. The cMDH orthologs that had not been sequenced previously were sequenced with the protocols described by Dong and Somero (22). The full-length cDNA sequence was obtained using the 5'- and 3'-rapid amplification of cDNA ends (RACE) protocol (Clontech Laboratories, Inc.) and sent to a commercial company for sequencing (Sangon Biotech Co., Ltd.).

The primers designed for sequencing and the GenBank accession numbers of cMDH cDNAs are shown in *SI Appendix*, Tables S5 and S6, respectively.

Analysis of Overall and Region-Specific Variation in Amino Acid Composition. Using the sequence data of cMDH cDNAs, 3D models were constructed by the I-TASSER server that had high C-scores (1.5–1.6) (28). C-score is a confidence score for estimating the quality of predicted models, which is calculated based on the significance of threading template alignments and the convergence parameters of the structure assembly simulations (28). C-score is typically in the range between -5 and 2, where a higher (positive) value signifies higher confidence of the model. The VMD program was used to calculate the solvent accessible surface area based on the computed 3D structure (29). Relative accessible surface area (RSA) was calculated as described by Tien et al. (30) to classify positions of residues. Residues with zero RSA were categorized as core residues, residues with RSA > 25% were categorized as surface residues, and the remaining residues were assigned to the intermediate region.

Molecular Dynamic Simulation of cMDH. The computed 3D structures above were used as the starting models of the simulations. Simulations were performed using NAMD 2.9 (31) as described by Dong et al. (2) for 20 ns at 57 °C (n = 5 or 10). Because the values of the rmsd of backbone atom positions stabilized after 10 ns, 20 ns was selected as a suitable and economical timeframe for the MDS of molluscan cMDH based on the test simulations (SI Appendix, Fig. S4). The VMD program was used to visualize and analyze the simulation trajectories (29). The rmsd of backbone atom positions and the rmsf for individual residues in all models were calculated and compared. For rmsd and rmsf calculations, the initial and energy-minimized structures, respectively, were used as the reference. They are defined as  $\operatorname{rmsd} = \sqrt{\frac{1}{N}\sum_{i=1}^{N}(r_i - r_o)^2}$  and  $\operatorname{rmsf} = \sqrt{\frac{1}{N}\sum_{i=1}^{N}(r_i - r)^2}$ , where  $r_i$  represents the position at time *i*,  $r_0$  represents the reference value, *r* represents the average value of the rms fluctuation, and N represents the number of atoms. The stabilized structure (10-20 ns) was taken from the trajectory of the system to determine the movements of protein backbone and individual residue atoms. Differences among cMDH orthologs simulations were analyzed using one-way analysis of variance (ANOVA) followed by the Tukey's multiple comparisons test (P = 0.05) with Prism 6.0 software (GraphPad Software).

Site-Directed Mutagenesis, Expression, and Purification of Recombinant Enzymes. cMDHs cDNAs were amplified by PCR using pairs of primers with restriction sites for EcoRI and XhoI (SI Appendix, Table S5). PCR products were purified and digested by EcoRI and XhoI and then ligated to pMD19 (TaKaRa) to generate the recombinant plasmids using T4 DNA ligase. The E. coli DH5a (TaKaRa) was used for initial cloning of pMD19-cMDH. Pairs of primers were designed for the SDM with the TaKaRa MutanBEST Kit. The recombinant plasmids pMD19-mut-P4A and pMD19-wt-Em were used as the templates to generate the recombinant plasmids pMD19-wt-Lk and pMD19mut-A4P, respectively. All of the pMD19-cMDHs were purified and digested by EcoRI and XhoI and then cloned into vectors pET32a(+) that digested by the same restriction enzyme above. The pET32a(+) recombinant vectors containing either the wild types (wt-Em, wt-Er, and wt-Lk) or mutants types (mut-G114S, mut-S114G, mut-P4A, and mut-A4P) were transformed into expression hosts, E. coli BL21(DE3) chemically competent cells (Weidi), and plated on Luria-Bertani (LB) agar medium containing ampicillin (100 µg/mL) at 37 °C overnight.

A single colony of transformed E. coli BL21(DE3) with pET32a(+)-cMDH was incubated overnight on a shaking incubator (Yiheng Scientific Instrument Co., Ltd.; THZ-103B, with a rotational radius of 20 cm) in 10 mL LB/ ampicillin broth medium at 37 °C with constant agitation (180 rpm). Plasmids were purified from individual colonies using an extraction kit (Aidlab). The sequences of target cMDHs in plasmids were verified by DNA sequencing. 200 mL of LB/ampicillin broth was inoculated and grown to log phase with vigorous shaking (180 rpm) at 37 °C for ~6 h. Isopropyl-β-D-thiogalactopyranoside (IPTG) was added to a final concentration of 0.5 mmol/L for expressions of target fusion proteins. The incubation period continued for another 6 h at 30 °C with shaking at 260 rpm. After inductions, the bacteria cells were pelleted at  $8,000 \times g$  for 10 min. The expressed protein was purified using an Ni-NTA agarose column according to manufacturer's instruction (Smart-lifesciences) at 4 °C. The pellet was resuspended in 10 mL lysis buffer (50 mmol/L potassium phosphate, pH 7.0, 300 mmol/L NaCl). Extraction was performed by an ultrasonic cell disruptor (Branson) with 30% amplitude kept cold by an ice water mixture (an extraction cycle with 10 s disruption and 10 s rest, in total 30 cycles of 10 min). The cell suspension was then centrifuged at 12,000  $\times$  g and 4 °C for 60 min. The supernatant was filtered (0.45  $\mu m$ ) and then passed over a 5-mL His-tag affinity column, which bound the poly His-tag attached to the N terminus of the recombinant cMDH and allowed rapid purification. After the column was washed (50 mL of 50 mmol/L potassium phosphate, pH 7.0, 300 mmol/L NaCl), the purified cMDH was eluted with 10 mL wash buffer plus 150 mmol/L imidazole. The purified protein was dialyzed with potassium phosphate buffer (50 mmol/L, pH 6.8) at 4 °C overnight. The qualities of purified recombinant proteins were analyzed on SDS/PAGE gel electrophoresis.

**Determination of**  $K_{\rm M}^{\rm NADH}$  and Rate of Heat Denaturation. The purified and dialyzed proteins above were used for assays. The reaction mixture for determining  $K_{\rm M}^{\rm NADH}$  contained imidazole-Cl buffer (200 mmol/L, pH 7.0, at 25 °C), oxaloacetic acid (200 µmol/L), and different concentrations of NADH (10, 20, 40, 75, 100, and 150 µmol/L).  $K_{\rm M}^{\rm NADH}$  values were calculated from the initial velocities of the reaction at each NADH concentration using Prism 6.0 software (GraphPad Software). Thermal stabilities were carried out as

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described by Fields et al. (32). Dialyzed enzyme preparations were heated at 40° or 57.5 °C for different periods of time. Aliquots were removed and assayed for residual cMDH activity. Differences among values were analyzed using one-way analysis of variance (ANOVA) followed by the Tukey's multiple comparisons test (P = 0.05) with Prism 6.0 software (GraphPad Software).

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