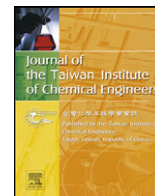




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Structural bioinformatics analysis of free cysteines in protein environments

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ABSTRACT

Cysteine has been considered as a “hydrophilic” amino acid because of its pK_a and its ability to form (weak) hydrogen bonds. However, cysteines are found mostly in hydrophobic environments, either in S–S (disulphide) form or in free cysteine form. When free cysteines are found on the surface of proteins, they are often involved in catalytic residues, as in cysteine proteases, P-loop phosphatases, *etc.* Additionally, a unique property of cysteines is that their side-chain volume is different from all other amino acids. This study is focused on the discrimination between structural versus active free cysteines based on a local environment analysis which does not appear to have been attempted previously. We have demonstrated the corresponding structural positions associated with free cysteines in their three-dimensional localization environment. We examined protein samples including nine, sequenced, coronavirus proteases and cysteine-rich non-membrane proteins. Our present study shows that the sequential environments of free cysteines of coronavirus proteases are rather hydrophobic and that the free cysteines of non-membrane proteases have a higher amount of contacts to hydrophobic residues and lower amount of contacts to polar or charged residues.

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1. Introduction

Cysteine is only incorporated into proteins at a level of 1.7% relative to the other amino acids (McCaldon and Argos, 1988; Nilsson *et al.*, 2005). Cysteine's importance in protein structure is related to the presence of a sulfur-containing thiol group in its side-chain. The thiol group of one cysteine residue is capable of combining with the thiol group of another to form a disulfide bridge, either linking two peptide chains together, as in the case of insulin, or causing a single peptide chain to fold back on itself, making a loop. The unique thiol side-chain (volume 219.43 \AA^3) of this amino acid is often heavily involved in maintaining the proper configuration of both structural proteins and enzymes. Because of its pK_a and ability to form (weak) hydrogen bonds, cysteine has been considered to be a “hydrophilic” amino acid. It has a sulfhydryl (SH) group and is found in most proteins.

When free cysteines are found on the surface of proteins, they are often involved as catalytic residues, *e.g.*, in cysteine proteases,

P-loop phosphatases that assist in the metabolism of various biochemicals, *e.g.*, heparin, biotin, coenzyme A and glutathione. In addition, they can be used in chelating metal ions, *e.g.*, in metallo enzymes, iron–sulfur clusters (F_2S_4), which is important in enzymatic and nucleophilic functions. When two cysteines are bonded by an S–S bond, the resulting molecule between the two protein chains is called cystine. The formation of disulfide bonds between cysteines present within proteins is important to the formation of active structural domains in a large number of proteins. However, they are found mostly in hydrophobic environments, either in free cysteine form (SH) or in disulphide form (SS). Recently, our lab has been involved in studying 3CL proteases which employ cysteine and histidine residues as catalytic dyads in the catalytic site. Around 4% of cysteine residues were observed in our protein sequence which showed a much higher fraction of amino acids within proteins than was expected.

The presence of a hydrophilic cysteine residue within the active site is what drew our attention. Thus we were particularly interested in having a better understanding of the roles played by free cysteines and in which they interact with other molecules. This project aimed at discriminating between structural, as opposed to, free cysteines based on analysis of their local environments.

In this study, we used computational approaches to annotate the free cysteines of individual cysteine-rich proteins, with criteria for determining the extent of other cysteine proteases. An analysis

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Abbreviations: Å, RMSD from the crystal structure of the complex; aa, amino acid; C, cysteine; SH, free cysteine form; SS, disulphide form; HSSP, a database of homology-derived secondary structure of proteins; PDB, Protein Data Bank; PERL, Practical Extraction and Report Language, a dynamic programming language; RMSD, the square deviations; pro, main proteinase.

that are used throughout the following discussion of our results. As shown in Table 1 columns, total aa, total hydrophobic aa, C total, C free, second structure (the locations of cysteine residues), and the residues surrounding cysteine in a 3.7 Å radius sphere are addressed. Table 1 shows a total of 87 cysteine residues collected from the non-membrane protein data sets, and those were further divided into two forms: 2 disulfide-bonding cysteines (Cys_SS), and 85 free cysteines (Cys_SH).

Our data show that free cysteines of non-membrane proteins prefer a β strand environment. For non-membrane proteins: the hydrophobic residues such as leucine, valine, isoleucine and alanine were more frequently seen in the spatial neighborhood around free cysteines; the same was observed for the aromatic phenylalanine residue. Thus, the sequential differences in the positions between Cys_SH and its local neighborhood among the non-membrane protein data sets suggest that the surrounding residues are mostly hydrophobic (Table 1). Moreover, free cysteines, among non-membrane proteins, have a high number of leucine contacts.

3.2. Relative position of the complement in the sequence among coronavirus proteases

In an attempt to determine information about the uniqueness of cysteine within 3CL cysteine proteases, we compared SARS 3CLpro to other coronavirus proteases. Thus, we applied a structure–base sequence alignment of these nine coronavirus main proteinases to identify any spatial correspondences involving cysteine among them. Residues comprising the nine coronavirus main proteases are illustrated in Fig. 1. It can be observed that this multiple sequences alignment figure shows a strong conservation of hydrophobic residues (valine, leucine, isoleucine, alanine phenylalanine and proline) and small residues (serine and glycine) in proximity to cysteine residues. The presences of 28 cysteine residues (around 9%) in well-conserved positions were also noticed. This indicates that these homologous proteins had a higher proportion of cysteine residues than others. Moreover, our findings show that the environment of free cysteines is rather hydrophobic and are in fair agreement with the results reported by

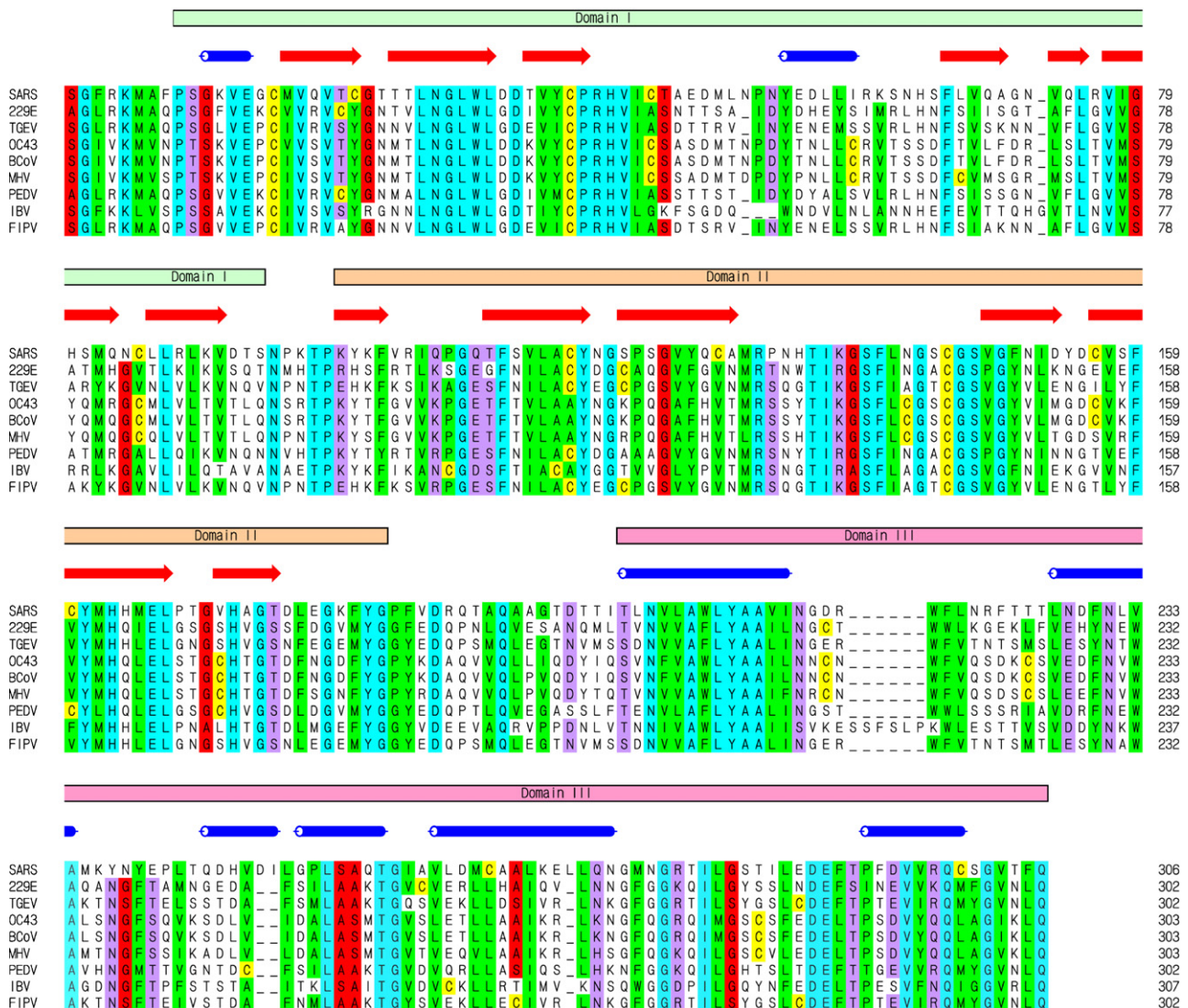


Fig. 1. Sequence alignment of nine coronavirus main proteinases. The corresponding sequences of SARS (3CLpro), 229E, TGEV, OC43, BCoV, MHV, PEDV, IBV, FIPV were derived from the replicate polyproteins of the respective viruses whose sequences are deposited at the DDBJ/EMBL/GenBank database (accession nos: SARS, gi|29837498; 229E, gi|30024078; TGEV, gi|30146762; OC43, gi|50844478; BCoV, gi|26008084; MHV, gi|25121563; PEDV, gi|30138155; IBV, gi|25121547; FIPV, gi|37999875). The α -helices, β -strands and the domains as revealed in the SARS 3CLpro crystal structure are shown above the sequence alignment. The alignment was produced using CLUSTAL W (Thompson *et al.*, 1994). Colored outlines indicate cysteine, identical, hydrophobic, small, and charge/hydrophilic similar amino acid residues, respectively, (yellow, blue, green, red, purple). (For interpretation of the references to color in this figure legend, the reader is referred to the web version of the article.)

Fiser *et al.* (1992) and Muskal *et al.* (1990), who showed that hydrophobic residues accumulated in the vicinity of free cysteines.

3.3. Comparison of associate residues between SARS 3CLpro and α -chymotrypsin protein

SARS 3CLpro (PDB ID code 1UJ1) forms a dimer with the two promoters oriented almost at right angles to each other. Initially, we identified SARS 3CLpro domains that somewhat matched the α -chymotrypsin domains. Fig. 2 shows that each monomer is folded into three domains, the first two of which are antiparallel β -barrels and together resemble the architecture in serine proteinases of the chymotrypsin family (PDB ID code 4CHA). Domain II of SARS 3CLpro is smaller than domain I and also smaller than the homologous domain II of α -chymotrypsin. As the quantitative results show the RMSD among 110 atoms is 1.906, including domain I and domain II for these two structures with a limit of 3.8 Å. With a limit of 2.0 Å, the RMSD result among 48 atoms for domain I is 0.990, and the RMSD result among 40 atoms for domain II is 1.156. These results show that

these two proteins are barely different in conformation. We have highlighted the side-chain of cysteines and the residues with the spatially equivalent residue positions of cysteine in the two proteins (Fig. 2(b)). α -Chymotrypsin has total eight residues (tryptophan, threonine, aspartic acid, glycine, proline, serine, alanine, valine) in the corresponding positions (cysteine residues in SARS 3CLpro), whereas SARS 3CLpro has total seven residues (leucine, valine, tyrosine, phenylalanine, asparagines) in the corresponding position (cysteine residues in α -chymotrypsin). Apparently, most of the spatially equivalent residues are subject to hydrophobic which may be somehow involved in catalysis.

3.4. Propensity to be clustered with hydrophobic residues

A superimposition (stereo image) of the structures of SARS 3CLpro demonstrates that cysteine residues not only favor positioning in a hydrophobic environment but also develop hunched posture in the surroundings of aromatic residues, see Fig. 3.

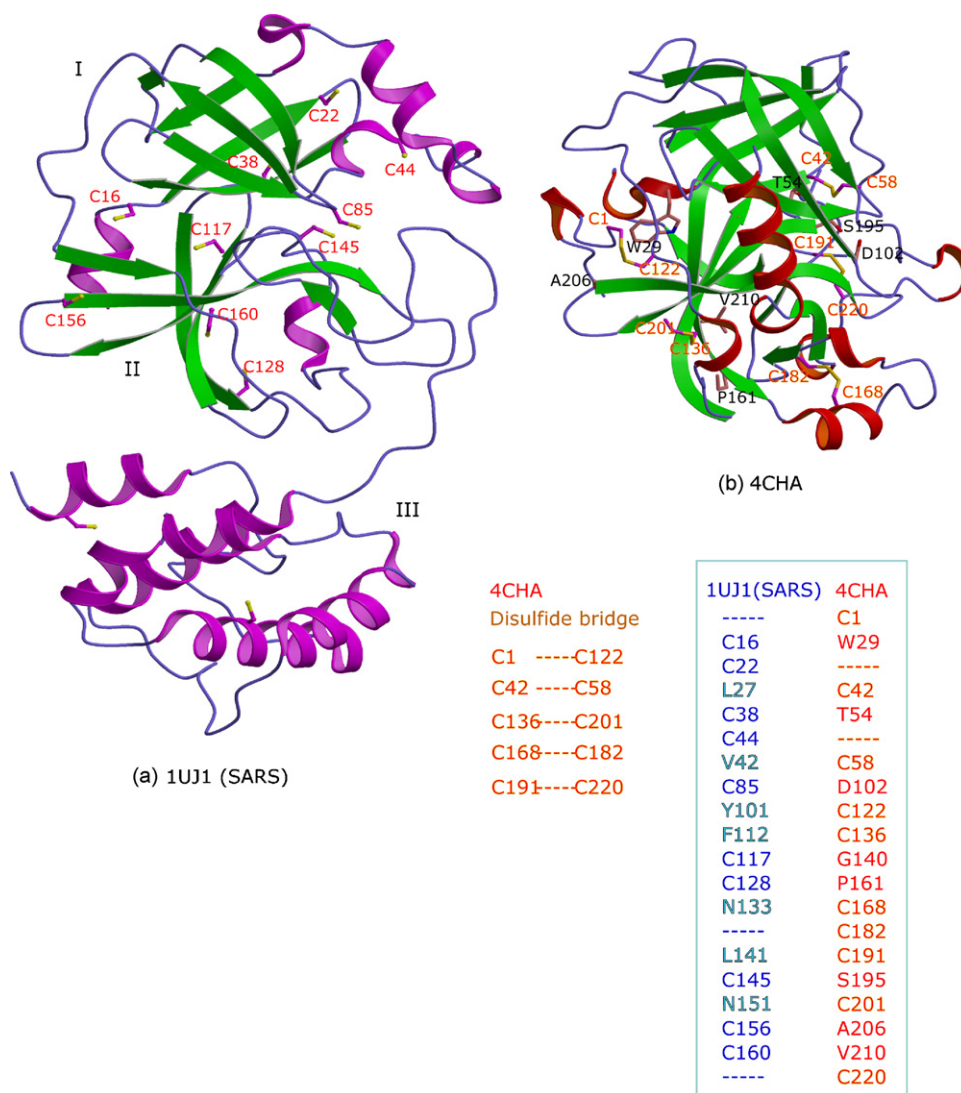


Fig. 2. A MOLSCRIPT diagram showing the SARS 3CLpro monomer and α -chymotrypsin (PDB code 4CHA) structures (a) a monomer of SARS 3CLpro is presented as ribbons, and cysteines exposed. It contains two β -barrel domains and the α -helical C-terminal domain. The β -barrels of each I and II are composed of 6-standard β -sheets of domain. Domain III is composed mainly α -helices. The first two of which are antiparallel β -barrels reminiscent of those found in the chymotrypsin family (b) an α -chymotrypsin (PDB code 4CHA) presented as ribbon and side-chain of certain residues are highlighted to the corresponding cysteins of SARS 3CLpro. Domain II of SARS 3CLpro is not only smaller than the domain I but also smaller than the homologous domain II of α -chymotrypsin.

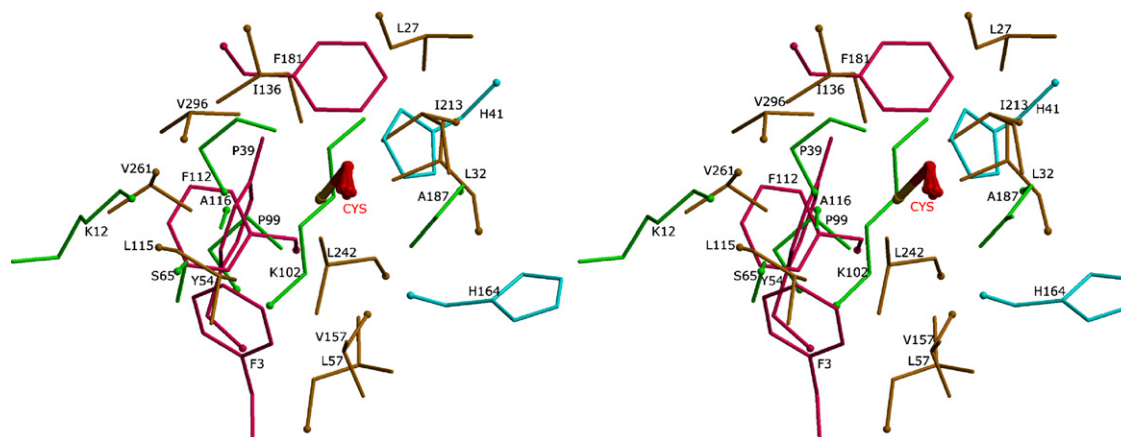


Fig. 3. Stereo image of superimposition of cysteines of SARS 3CLpro (PDB code 1UJ1). The residues surrounding cysteine in a 3.7 Å radius sphere are Phe, Tyr (in purple/pink color), His (color in cyan), Leu, Ile, Val (in gold color), Ala, Pro, Ser, Lys (in green color). (For interpretation of the references to color in this figure legend, the reader is referred to the web version of the article.)

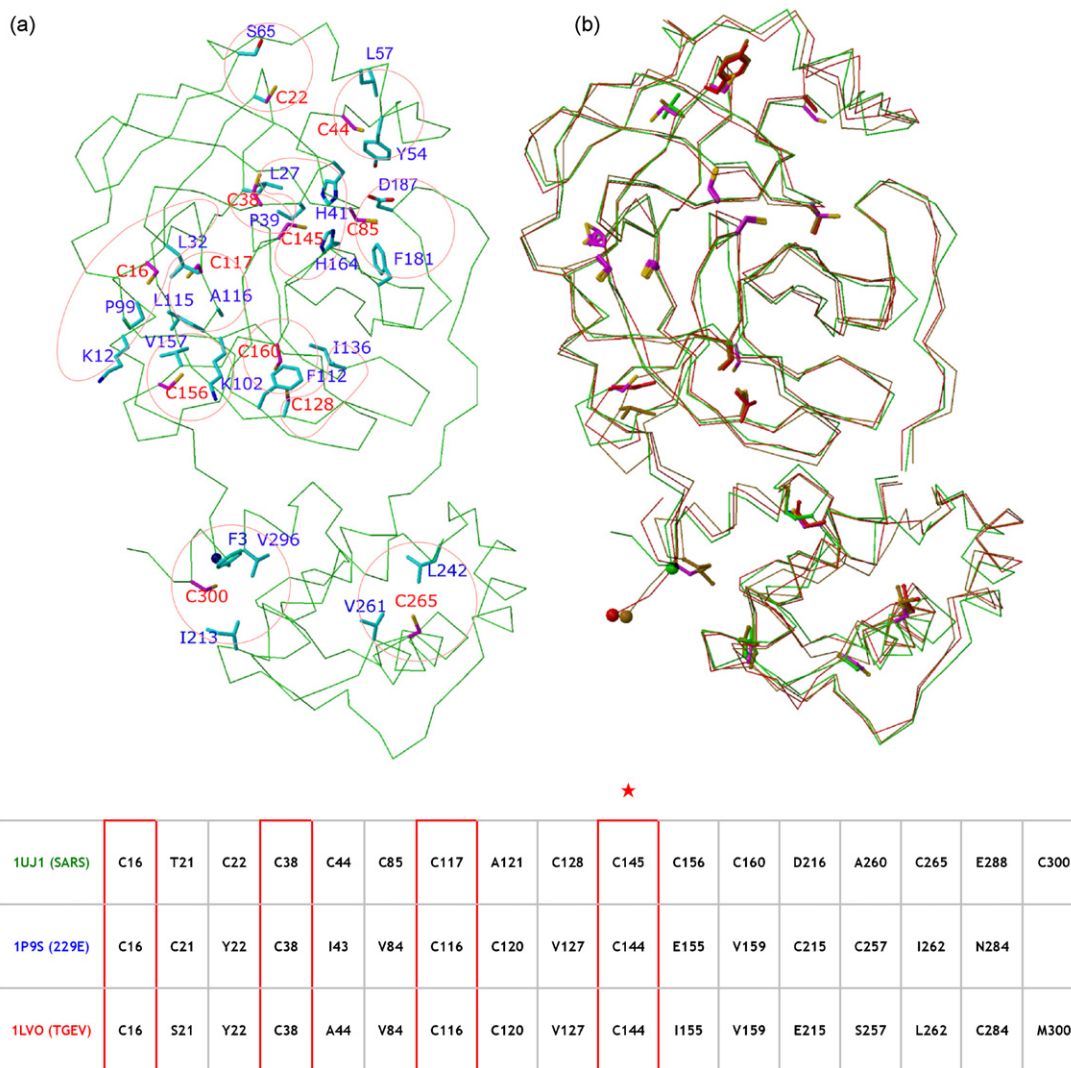


Fig. 4. Comparison of the structure SARS 3CLpro (PDB code 1UJ1) with 229E (PDB code 1P9S) and TGEV (PDB code 1LVO). Figures were generated using MOSCRIPT. (a) Cα-trace of SARS 3CLpro monomer. Residues of cysteine and those surrounding cysteine of 3.7 Å are indicated. (b) Cα-trace of SARS 3CLpro (green) superimposed on 229E (blue) and TGEV (red). The backbone structure was locally aligned with each other in two regions. Side-chains of certain residues are highlighted for 229E and TGEV that are identical or that are in the close proximity to the corresponding cysteines of SARS 3CLpro. (For interpretation of the references to color in this figure legend, the reader is referred to the web version of the article.)

Cysteines and the residues surrounding cysteine in a 3.7 Å radius sphere were identified in a C α -trace outline for SARS 3CLpro monomer (PDB ID code 1UJ1). See Fig. 4(a). This figure shows that as the hydrophobic residues such as leucine, valine, phenylalanine, and isoleucine were more frequently seen in the spatial neighborhood around free cysteines. SARS 3CLpro (PDB ID code 1UJ1) was then superposed with the other two 3CL proteases 229E (PDB ID code 1P9S) and TGEV (PDB ID code 1LVO). These three proteins are similar to each other and can be superposed well (RMSD 1.12–1.18). Fig. 4(b) shows the superimposed C α profile of SARS 3CLpro, 229E and TGEV. The side-chains are also highlighted on the spatially conserved residues which correspond to the residue of the free cysteine. The spatial corresponding residues to free cysteines within each are serine, tyrosine, alanine and valine. These residues are well conserved according to a Risler matrix (Risler *et al.*, 1988).

3.5. Analysis of free cysteine distributions of SARS 3CL proteases, and non-membrane protein environments

Proteins having similar functions but from different sources can be identified by their sequences. A statistical analysis of the amino acids frequencies associated with nine 3CLpro alignment sequences has revealed the results shown in Fig. 5(a).

Fig. 5(a) shows the frequency of occurrences of alternative residues in the cysteine conservation. Our findings reveal that alanine, valine, serine, leucine, and threonine were more frequently observed among these nine coronaviruses (3CLpro) main proteinases. Thus, we can conclude:

- (1) the cysteines are frequently found in hydrophobic regions containing alanine, valine, and leucine;
- (2) small residues (serine and threonine) are favorable to be substituted with cysteine residues. These residues are relative smaller than the existing cysteine, thereby producing conservative changes that would not disrupt the native structure.

We have analyzed the distribution of residues around the sulfur atom of cysteine. It has been verified that the top eight occurrences of residues embedding cysteine (in a radius of a 3.7 Å sphere) in non-membrane proteins were leucine, phenylalanine, valine, alanine, isoleucine, proline, threonine and serine. These are classified as either hydrophobic or small residues (see Fig. 5(b)).

3.6. Interaction with aromatic rings of non-membrane proteins

It has been reported that in order to stabilize interactions involving cysteine residues that the free sulfhydryl group prefers to interact closely with the face of aromatic rings (Klingler and Brutlag, 1994; Pal and Chakrabarti, 1998). Thus, our data show that, based on the 3D spatial orientation, the aromatic rings of a selected residue, *i.e.* phenylalanine are most likely to be in contact with the sulfur atom of cysteines. We carefully examined some other non-membrane proteins. Approximately 62% and 60% of the aromatic ring faces of phenylalanine and tyrosine, respectively were clustered contiguously to the sulfur atom of cysteines, contrary to the way tryptophan (W) behaved. See Fig. 6. This might be because tryptophan not only has the largest nonpolar accessible surface area, but also observed less frequently in our

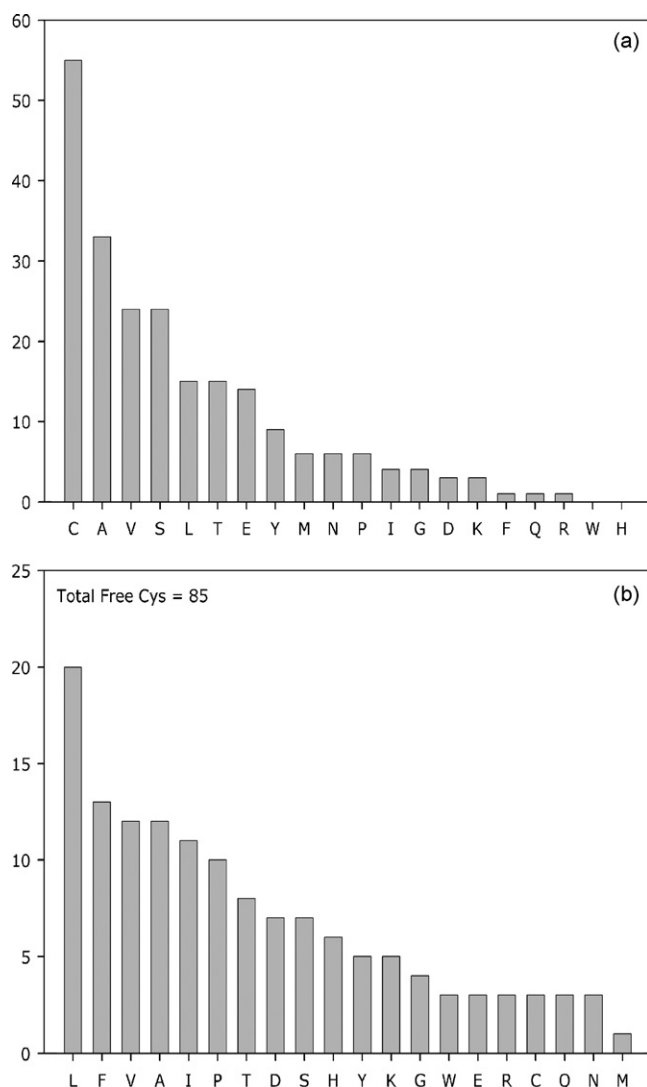


Fig. 5. Plots of occurrences of residues. (a) 28 cysteines conserved locations were observed of the sequence alignment of 9 coronaviruses (3CLpro) main proteinases. An occurrence of alternative residues in the cysteine conservation is revealed. This indicates cysteines are highly conserved in hydrophobic region, and smaller residues are favorite substitution. (b) Discrepancy in occurrences of residues which embedding cysteine (a distance less than 3.7 Å, sidechain-S of cysteine is as the center) for various classes of proteins (cysteine proteases, phosphatases, kinases, interleukins, transcription factors, motility proteins, metabolic enzymes, virus capsid proteins, and ribosomes). This indicates that either hydrophobic residues or small residues were cluster with cysteines.

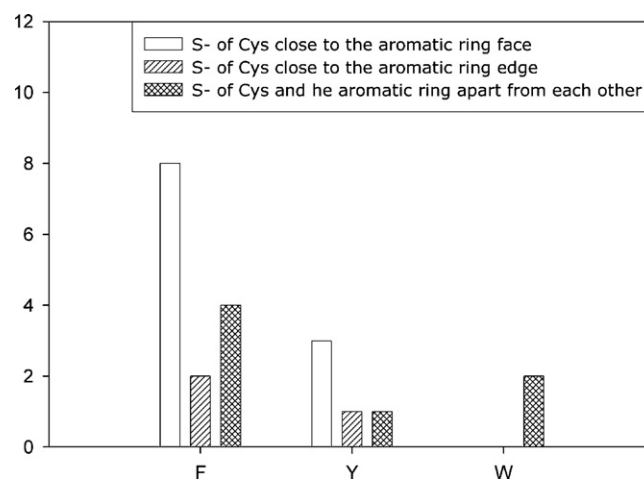


Fig. 6. Distribution of the relative position between sulfur atom of cysteine and the aromatic ring of F, Y, W in a 3.7 Å radius sphere (non-membrane proteins). The aromatic ring faces of phenylalanine and tyrosine respectively were clustered contiguously to the sulfur atom of cysteines, contrary to the way tryptophan (W) behaved.

selected proteins. In this regard, further investigation to provide a quantitative explanation is needed.

3.7. Relative location of free cysteine residues

From the data collected, we observed that approximately 23% of free cysteine residues of non-membrane proteins were located in the α -helix and 77% were found in the β -strand (Table 1). This observation correlates positively with a tendency for cysteine to occur preferentially in the β -strand (Williams *et al.*, 1987; Wilmot and Thornton, 1988).

4. Conclusions

Knowledge of the details of protein structures offer a range of possibilities for investigating their biological functions (Baker *et al.*, 2003; Eisenstein *et al.*, 2000; Teichmann *et al.*, 2000). Conserved residues mapping on certain characteristics may likewise identify a key site or perhaps a sensible function. Accordingly, the approaches we have presented were based on the structures. Although spatial contacts have been studied to derive contact potentials for the different amino acid interactions (Brocchieri and Karlin, 1995; Miyazawa and Jernigan, 1996, 1999), the common strategy is to study the number of contacts within a given distance cut-off. To our knowledge structural bioinformatics detection of the cysteines has not been attempted previously. This study has revealed, for the first time, the discrimination of structural versus active free cysteines based on local environment analysis. The computational prediction and annotation of free cysteines in the protein environments has been described through analysis of 3D spatial correspondences.

Essentially we have demonstrated the corresponding structural positions associated with free cysteines in their three-dimensional environment and the frequency of occurrence of the residues surrounding the free cysteines in selected proteases. The types of residues involved in spatial contacts with free cysteines of non-membrane proteins found in the present study indicated that free cysteines have a higher capacity for contacts to hydrophobic residues and lower capacity for contacts to polar/charged residues.

We also examined nine sequenced coronavirus proteases including three primarily coronavirus proteases (SARS 3CL, 229E, TGEV) whose structures have been solved. For these it was shown that the sequential environments around free cysteines were rather hydrophobic.

The use of combined 3CL main proteases and cysteine-rich proteins (membrane/non-membrane proteins) database mining approaches allowed for the classification of free cysteines in proteins. The validity of this approach was supported by the identification of some known proteases. The identification and functional characterization of the free cysteines will have implications in many aspects of biology. Moreover the sets of these proteins and the knowledge-based methods used to identify

them will form the foundation in the algorithms used for detection, in particular, within the protein sequence.

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