### **ORIGINAL PAPER**



# **Leveraging molecular docking to understand Congo red degradation by** *Staphylococcus caprae* **MB400**

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## **Abstract**

Congo red (CR) is a genotoxic, sulphonated azo dye and poses signifcant pollution problem. We hereby report its degradation by *Staphylococcus caprae* MB400. The bacterium initially propagated as a suspected contaminant upon CR dye supplemented nutrient agar plates, forming zones of clearance around its growth area. The bacterium was purifed, gram stained and identifed as *Staphylococcus caprae* via 16S rRNA gene sequencing. Dye decolourization was analysed in liquid culture, and Fourier-transform infrared spectroscopy (FTIR) was conducted for analysis of degraded product/metabolites. A decolourization of ~96.0% at 100  $\mu$ g/ml concentration and pH 7 after 24 h of incubation was observed. Structure of the azoreductase enzyme, responsible for breakage of the bond in the dye and ultimately decolourization, was predicted, and molecular docking was harnessed for understanding the mechanism behind the reduction of azo bond  $(-N=N-)$  and conversion to metabolites. Our analysis revealed 12 residues critical for structural interaction of the azoreductase enzyme with this dye. Among these, protein backbone region surrounding four residues, i.e. Lys65, Phe122, Ile166 and Phe169, showed major displacement changes, upon binding with the dye. However, overall the conformational changes were not large.

**Keywords** Congo red · Azoreductase · Bioremediation · Molecular docking · Bioinformatics

# **Introduction**

Azo dyes are a diverse group of synthetic colorants, widely used in various industries (Guo et al. [2020](#page-9-0)). The global concerns about the potential hazards of azo dyes have risen over past few years, as they are xenobiotic and recalcitrant in nature (Fernando et al. [2019](#page-9-1); Picho-Chillan et al. [2019](#page-9-2)).



Disposal of these dyes into the environment causes serious damage, since they may significantly affect the photosynthetic activity of hydrophytes by reducing light penetration and also they may also be toxic to aquatic organisms due to their breakdown products (Hernández-Zamora and Martínez-Jerónimo [2019](#page-9-3)). These dyes may alter pH of environment, increase biochemical oxygen demand and chemical oxygen demand and give deep coloration to water bodies and/or surrounding environments in which they are discharged (Yadav et al. [2013](#page-10-0); Katal et al. [2014](#page-9-4); Dinçer [2020](#page-9-5)). The removal of dyes from industrial waste is necessary, from health and hygiene point of view and for environmental protection, before their entrance and potential toxicity into the water bodies.

Removal of coloured dyes from industrial effluents can be achieved by different conventional methods such as ozonation, photooxidation, electrocoagulation, adsorption, activated carbon, froth fotation, reverse osmosis and membrane filtration. These physiochemical techniques are not economical and also are less efficient in terms of restricted applicability and may generate waste which is dif-ficult to dispose (Chen et al. [1999;](#page-9-6) Singh and Arora [2011](#page-9-7); Shah [2019](#page-9-8)). Methods that do not generate any waste like

advanced oxidation products and membrane fltrations are not cost-efective and linked with more energy utilization (Pandey et al. [2007](#page-9-9); Yagub et al. [2014](#page-10-1)). Biological treatment methods, through which the removal of dyes from polluted environment can be achieved for decolourization of dyes, are considered more feasible and efficient. Various microorganisms and their enzymes azoreductases and oxidases capable of decolorizing azo dyes have been isolated and characterized (Suzuki et al. [2001](#page-10-2); Blümel et al. [2002](#page-9-10); Koyani et al. [2013](#page-9-11); Oturkar et al. [2013](#page-9-12); Sarkar et al. [2020\)](#page-9-13).

Microbes are economically feasible source of remediation of azo dyes. The decolourization of azo dyes with bacteria can be undertaken in wide range of environments, by diferent groups of bacteria (Saratale et al. [2013;](#page-9-14) Naseer et al. [2016;](#page-9-15) Eskandari et al. [2019](#page-9-16)). To understand the bioremediation interactions, computational docking has also been employed for observing interaction between various enzymes and azo dyes (Basharat et al. [2017;](#page-9-17) Srinivasan and Sadasivam [2018](#page-9-18)). The present study aimed to investigate a bacterium isolated as a contaminant, later identifed as *Staphylococcus caprae* for decolourization of CR, a sulphonated azo dye, under various environmental conditions, i.e. concentration of dye, pH, temperature and static or agitating conditions of incubation. This was followed by database mining and in silico analysis of azoreductase enzyme responsible for this degradation phenomenon.

## **Materials and methods**

#### **Initial characterization**

The bacterium propagating as contaminant on dye supplemented agar plate was named MB400, isolated and purifed. Physical and biochemical characterization of parameters like colony morphology, gram's staining, growth on Eosin Methylene Blue (EMB) agar, MacConkey's agar, etc., was carried out. DNA extraction was done through phenol chloroform method (Wilson [1987;](#page-10-3) Cheng and Jiang [2006](#page-9-19)), followed by PCR amplifcation of the 16S rRNA gene using universal set of primers. The product was sequenced by Macrogen (Korea). Obtained FASTA sequence fle was subjected to BLAST analysis and alignment with signifcant hits (of rRNA gene sequences) in the NCBI database to reveal genus and species of the bacterium under consideration. The bacterium was identifed as *Staphylococcus caprae*. Similar 16S rRNA gene sequences were derived by BLAST and aligned along with 16S rRNA sequence of *Bacillus rhizoplanae* strain JJ-63 as an out-group (Accession ID: NR\_181926.1). Phylogenetic analysis was conducted using MEGA-X software (Kumar et al.  $2018$ ). Initial tree(s) for the heuristic search were obtained automatically by applying Neighbour-Join and BioNJ algorithms to a matrix of pairwise distances estimated using the Jukes–Cantor model (Erickson [2010](#page-9-21)), and then selecting the topology with superior log likelihood value.

#### **Study of decolourization activity**

Nutrient agar was obtained from Merck, and CR (IUPAC name: disodium 4-amino-3-[4-[4-(1-amino-4-sulfonatonaphthalen-2-yl)diazenylphenyl]phenyl]diazenyl-naphthalene-1-sulfonate) was purchased from Sigma-Aldrich. All experiments were performed in sterile conditions. Decolourization experiments were carried out on both solid agar slants and in liquid nutrient broth medium. 100 ml fasks were used for liquid culturing with varied amounts of dye concentration. Incubation at diferent temperatures (25, 37, 40 °C), pH  $(6, 7, 8)$  and in static as well as shaking condition was done for 24 and 48 h. This was followed by centrifugation at 3000 rpm for 10 min and determination of decolourization activity by spectrophotometer (PG Instruments) at an absorbance of 498 nm. The nutrient broth was taken as blank and broth with dye as control. Decolourization was calculated as described previously (Aftab et al. [2011\)](#page-9-22).

FTIR analysis was carried out to determine fate of dye inside cell mass. The cell mass of control and experimental samples (settled at the base of tubes after centrifugation) was dried in desiccator for 72 h, mixed with KBr in 1:20 ratio separately, ground and pressed with hydraulic presser to obtain IR- transparent pellets. The absorbance FTIR spectra were collected (using FTIR-8400, SCHMIDZU) within a scanning range of 4000–250 cm<sup>-1</sup>. The FTIR was calibrated for background signal scanning with a control sample of pure KBr pellet, and then, the experimental samples were scanned. The FTIR spectrum of control was fnally compared with spectra of sample to observe changes in their IR peaks.

#### **Bioinformatic analysis**

The azoreductase family comprises an array of enzymes with varied structure and functional properties. Evolution has also impacted the sequence conservation along with selection pressure and mutations. To study the details of this, enzyme sequences of *Staphylococcus caprae* azoreductase, responsible for dye degradation, were obtained from the NCBI database with accession number WP\_002444591.1 (208 amino acid) and WP\_002441143.1 (188 amino acid). These paralogs were subjected to alignment with CLUSTALW and synteny analysis with other *Staphylococcus* spp. Subcellular localization was predicted using PSORTb server [\(https://](https://www.psort.org/psortb/) [www.psort.org/psortb/](https://www.psort.org/psortb/); accessed 10 April, 2023) (Yu et al. [2010\)](#page-10-4). Structure modelling was done through SWISS-Model (Kiefer et al. [2009](#page-9-23)) using indigo reductase from *Bacillus smithii*-type strain DSM 4216 (PDB ID: 6JXN) as template.

Sequence identity was 63.94, and coverage was 100%. Structure was refned using Molecular Operating Environment v2019.0102 (MOE). 3D protonation was done in a neutral environment. System was optimized, with ASN/GLN/HIS fip allowed. A force constant of 5000 was used for tethering the receptor, with a buffer constant of 0.25, and structure was refned to 0.1 kcal/mol/A. The dye structure was obtained from PubChem and converted to 3D conformation. It was then prepared for docking after a wash at pH:7 and dominant protonation in MOE. Docking was done with triangle placement matcher method (return poses=1000), receptor was kept rigid, and rescoring was done with London dG (30 poses) and GBVI/WSA dG (5 poses). Top conformer with least S value was selected for further processing. Docked protein MM/GBSA energy was calculated using SVL script. The parameters were: salt: NaCl, concentration: 0.1 M, temperature =  $300$  K, interior dielectric = 1 and exterior dielectric=80. Oral and *Tetrahymena pyriformis* toxicity was predicted using admetSAR 2.0 (Yang et al. [2019](#page-10-5)). Molecular dynamics (MD) simulation study was conducted for 100 ns using Desmond (Schrodinger Inc.). The system was prepared by solvating and neutralizing the complex, followed by energy minimization (Basharat et al. [2023](#page-9-24)). Finally, various analyses were performed on the trajectory in Bio3D package of R, to understand the behaviour of the system. Overlap between CR bound and unbound azoreductase protein was also done by normal mode analysis (Suhre and Sanejouand [2004\)](#page-9-25).

## **Results**

*Staphylococcus caprae* was initially isolated from goats (Devriese\* et al. [1983;](#page-9-26) Vandenesch et al. [1995](#page-10-6)) and later from humans, mostly immunocompromised (Kanda et al. [1991;](#page-9-27) d'Ersu et al.  $2016$ ). It is difficult to isolate it from environment, and according to the authors knowledge, this is the frst report where we report its propagation as contaminant in laboratory. We characterized the bacterium and then subjected to detailed wet and dry laboratory analysis for dissection of CR degradation mechanism. The 16S rRNA gene sequence of this strain has been deposited in NCBI, with the accession number KP723540.1. Phylogenetic tree of closely related sequences is shown in Figure [1.](#page-2-0)

#### **Physicochemical characteristics of bacterium**

Whitish colonies were observed for isolated *Staphylococcus caprae* MB400 strain with naked eye and brown under the microscope. Texture was moist and creamy, while gram staining was positive. Growth of strain on various media revealed that it was incapable of utilizing lactose (as did not show growth on agar) as well as lacked an ability to ferment



<span id="page-2-0"></span>**Fig. 1** Phylogenetic tree was inferred by using the maximum likelihood method. The tree is drawn to scale, with branch lengths measured in the number of substitutions per site. This analysis involved 7 nucleotide sequences from NCBI, based on BLAST similarity and one out-group (*Bacillus* sp.). Codon positions included were frst, second, third and noncoding. There were a total of 1542 positions in the fnal dataset, and the fnal tree had a log likelihood of − 2646.24

(as did not show growth on MacConkey's agar). It was also coagulase negative.

#### **Dye decolourization and degradation analysis**

The bacterium was capable of growth and degradation of dye tested up to 400 µg/ml. Optimum degradation was achieved at pH 7 and temperature 40  $^{\circ}$ C (Table [1\)](#page-3-0) in shaking condition (150 rpm/min). Decolourization was also tested under static condition at 37 °C and pH 7. Static conditions were found suitable for *Staphylococcus caprae* MB400 as it showed 97.67% and 98.33% decolourization after 24 and 48 hours of incubation, respectively.

More decolourization was observed at static condition which means aeration had little role in stimulating bacterium, and it was more prone to anaerobic mode of action. This also means that adsorption of dyes to cell surface for enhanced dye degradation was of little importance and degradation through absorption and enzymatic dye processing or release of enzymes into the medium was more prospective.

FTIR spectrum of CR control showed specifc peaks in fngerprint region for unsubstituted and multi-substituted naphthalene or benzene rings. This was supported by the peaks (559 cm<sup>-1</sup> for C–C bending vibrations), 680 cm<sup>-1</sup> (for C–H stretching vibrations for disubstituted aromatic compound), 875 cm−1 (for p-disubstituted ring vibrations), 1093 cm<sup>-1</sup> (for S=O stretching vibrations of sulfonic acid), 1261 cm<sup>-1</sup> (for C–N bending vibrations), 1400 cm<sup>-1</sup> (for aromatic C=C stretching vibrations), 1647 cm<sup>-1</sup> (for N=N

<span id="page-3-0"></span>

stretching vibrations), 3132  $cm^{-1}$  (for O–H stretching vibrations).

The FTIR spectrum of *Staphylococcus caprae* MB400, after 24 hours of decolourization, showed peaks at  $3103.5$  cm<sup>-1</sup> (C–H in aromatic compounds), 2850.88 cm<sup>-1</sup> (CH stretching in alkanes), 1662.69 cm−1 (C=O stretching vibrations in amide), 1394.58 cm−1 (CH3 symmetrical vibrations in aromatic compounds), 1261.44 cm<sup>-1</sup> (aromatic C–N stretching), 1093.67 cm−1 (C–N stretching of aliphatic amine), 1022.31 cm<sup>-1</sup> (C–N stretching in alkyl amine), 875.71  $cm^{-1}$  (CH out of plane deformation in metadisubstituted aromatic compounds), 800.49 cm−1 (CH out of plane vibrations for para-disubstituted aromatic compounds),  $561.30 \text{ cm}^{-1}$  (C-Br stretching in alky bromide). The spectrum taken after 48 hours of decolourization showed peaks at  $1394 \text{ cm}^{-1}$  (CH3 symmetrical vibrations in aromatic compounds),  $1261 \text{ cm}^{-1}$  (aromatic C–N stretching), 1095.60 cm<sup>-1</sup> (C-N stretching of aliphatic amine),  $1024.24$  cm<sup>-1</sup> (C–N stretching in alkyl amine), 875.71 cm<sup>-1</sup> (CH out of plane deformation in meta-disubstituted aromatic compounds), 802.41 cm<sup>-1</sup> (CH out of plane vibrations for para-disubstituted aromatic compounds), 561 cm<sup>-1</sup> (C-Br stretching in alky bromide). The spectrum of supernatant had peaks at  $1647.26$  cm<sup>-1</sup> (CN bending vibrations of primary amine), 1400.37 cm<sup>-1</sup> (CH3 symmetrical vibrations in aromatic compounds), 1261.49 cm<sup>-1</sup> (aromatic C-N stretching), 1180.60 cm−1 (C–N stretching in alkyl amine), 1068.60 cm<sup>-1</sup> (C–N stretching aliphatic amines), 875.71 cm−1 (CH out of plane deformation in meta-disubstituted aromatic compounds), 798.56 cm<sup>-1</sup> (CH out of plane vibrations for para disubstituted aromatic compounds), 599.88 cm−1 (C–Br stretching in alky bromide) (Supplementary Figure 1).

#### **Conservation and structural prediction**

Alignment of sequences showed very little conservation (Figure [2](#page-3-1)). Synteny analysis showed conservation of gene apparatus in 71 *Staphylococcus* species, ranging from 83% in *Staphylococcus haemolyticus* to 19% in *Staphylococcus* 



<span id="page-3-1"></span>**Fig. 2** Aligned residues of both isoforms of azoreductase from *Staphylococcus caprae* and the sequence of indigo reductase from *Bacillus* sp., used for modelling the fnal structure of longest isoform. Red regions show conservation

*xylosus.* Capsule synthesis genes and beta-lactamase genes were found in immediate vicinity of azoreductase. No conservation of azoreductase genes was observed for 86 *Staphylococcus* species. Azoreductase sequence domain with accession PRK00170, spanning amino acid region 1-207 with E value of  $4.82e^{-107}$ , was observed for first paralog, while SsuE domain (for FMN reductase) from 1 to 188 amino acid with an E value of  $1.45e^{-47}$  was obtained for second paralog.

We predicted the 3D structure of longer paralog (Figure [3A](#page-4-0)), i.e. with 208 amino acids, based on this approach using a template of *Bacillus smithii* indigo reductase. Indigo reductase has a role in in the fermentation process responsible for aidate (indigo dyeing). Total 388 templates were found, and the homo dimeric 231 amino acid long template (PDB ID: 6JXN) with most similarity was used for structure building. Modelled structure (Figure [3A](#page-4-0)) had a global model quality estimate of 0.83 and Qmean of -1.23. Global quality score is between the range 0 and 1, and higher number means better model. Qmean is a composite quality score, with value below − 4 indicative of bad models. Our protein had better scores, showing a good quality. Ramachandran plot (Figure [3B](#page-4-0)) depicted 94.66% residues in most favoured regions. Only 0.73% residues were outliers.

#### **Docking analysis**

Docking can provide valuable insights into the binding afnity and specifcity of a ligand. For this purpose, frst property analysis and structure preparation of both enzyme and dye were done. The topological surface area of CR was 232.64  $A^2$  with octanol water partition coefficient of

− 0.05. Molecular weight of the compound was 696.68 g/ mol. An acute oral toxicity of 3.626 kg/mol and pIGC50 of 1.067 ug/L for Tetrahymena pyriformis was predicted. Total 432 conformations were obtained for the enzyme binding, using rotate bond, and 299 site points were recorded with triangle matcher method. 994 non-duplicate binding poses were obtained, and refned and top complex with least S value of − 6.63 was selected for interaction analysis. Three residues (Table [2\)](#page-5-0) made bonded interactions, while nonbonded interactions were observed for other nine residues (Figure [4](#page-5-1)).

Six interactions were with polar (Lys54, Thr58, Gly61, Lys62, Lys65 and Tyr124) and six with greasy residues (Leu57, Trp60, Ala116, Phe122, Ile166 and Phe169). No interactions with acidic residues were observed. Thr58 made an arene-H bond interaction and Lys65 donated electrons at two positions, while Thr124 at one position of the sulphonated region of the dye. MM/PBSA energy of CR was − 55.427, while after binding with enzyme was − 17.627.

#### **MD simulation analysis**

MD simulation can be particularly useful for validating and complementing the docking analysis. Docking is limited to predicting the static binding mode, but MD simulations can provide information about the dynamic behaviour of the complex and the binding stability over time. By comparing the results of docking with MD simulations, one can validate the predicted binding mode and determine if it is stable over time. This can help to improve the accuracy of docking predictions and provide a more detailed understanding of the molecular interactions involved in ligand–receptor binding.





<span id="page-4-0"></span>**Fig. 3 A** 3D structure of the azoreductase of *Staphylococcus caprae*. Structure is depicting both chains in the fgure. **B** Ramachandran plot analysis of the structure showing majority residues in favoured

region. Only two outliers, i.e. ILE115 and PRO129, were observed. 6 C-beta deviations and 1 twisted non-proline were observed

<span id="page-5-0"></span>**Table 2** Bonded interactions of CR with *Staphylococcus caprae* azoreductase at atomic scale





<span id="page-5-1"></span>**Fig. 4 A** 2D structure of the CR dye. **B** 2D interaction plot of the receptor-dye plot. Dye exposure area to solvent residues is shown in blue, while proximity contour is shown by dotted line. Arrows indicate direction of electron transfer

Simulation results revealed stable binding, with RMSD values not exceeding 3 Å for azoreductase (Fig. [5](#page-6-0)A). Residues near position 60–70 (helical and loop region), around position 125 (loop region) and 150 (loop regions), showed fexibility (Fig. [5B](#page-6-0)). Principal component analysis (PCA) of the simulation trajectory revealed higher eigenvalues for PC1, followed by lower values for PC2 and PC3 (Fig. [5](#page-6-0)C, D and E). The fact that PC1 had the highest eigenvalue means that it captures the most important and dominant motion or conformational change in the system. PC2 and PC3 captured smaller, more subtle motions or changes that occur during the simulation and were less important in explaining the overall variance in the data. However, a change of 35% does not depict very large change (Fig. [5](#page-6-0)F). This is evident from normal mode analysis as well (Fig. [6](#page-7-0)A). Overlaying the various frames of trajectory at intervals of 20 ns revealed that the CR was undergoing change in position with reference to azoreductase but not too much (Fig. [6B](#page-7-0)). The RMSD of trajectory frames with reference to complex structures complements this fnding in detail (Fig. [6](#page-7-0)C). The results indicate that the system is undergoing conformational changes at small scale.

A normalized mean square displacement <R2> of all C-alpha atoms in the protein bound and unbound with CR showed a B-factor correlation of − 0.805 for C-alpha atoms for 100 normal modes. Initial two and last two modes were analysed to see the deviation. In all modes (Figure [6A](#page-7-0)), major displacement was observed around atomic region 932-1116.

This is the region linked with residues Trp60 to Glu73, and out of these 13 residue regions, four were making interactions with the CR dye. The highest displacement was observed near Lys65, i.e. at Gly66. Lys65 is involved in direct interaction with dye, and hence, the region nearby underwent conformational change as well as c-alpha displacement. Other displacements were observed at around atom number 1911-1918 (linked with residue Phe122 and Lys123) and atom number 2383-2949 (linked with several residues, including two binding residues Ile166 and Phe169). Phe122 is also making an interaction with the ligand, hence, the displacement. This confrms our analysis that binding perturbed the regions where an interaction was occurring.

#### **Discussion**

This is a distinctive study making use of an environmental bacterium to study azoic dye degradation and its *in silico* aspects. The bacterium showed good biodegradation as evident from FTIR analysis. Membrane bound azoreductase enzymes have the ability to reduce non-sulphonated azo dyes as they can difuse through the bacterial cell membrane (Sarkar et al. [2017\)](#page-9-29) and azoic dyes comprising sulphonate groups and higher molecular weights are not likely



<span id="page-6-0"></span>**Fig. 5 A** A 100 ns RMSD plot for simulation of azoreductase bound with CR. **B** RMSF plot of the enzyme. **C** PC1 and PC2 plot of simulation. **D** PC2 and PC3 plot of simulation. **E** PC1 and PC3 plot of

to be transferred across the cell membranes. As a result, the reducing action of the dye is independent of the intracellular dye uptake. It was suggested by Russ et al. that bacterial membranes are nearly impermeable to co-factors having favin. Therefore, they restrict reduction of sulphonated azo dyes due to equivalent transfer by cytoplasmic favins (Russ et al. [2000](#page-9-30)). An alternate mechanism for sulphonated azoic dye reduction in cells with intact membranes occurs due to genesis of reduced favins by the cytoplasmic favindependent azoreductases (Russ et al. [2000](#page-9-30); Feng et al. [2010](#page-9-31); Morrison and John [2015\)](#page-9-32). Another mechanism of reduction in the extra-cellular environment is based on electron transport and is achieved by establishment of link between intracellular electron transport systems of bacterial cell and azobenzene dye molecules of high molecular weight. Outer membranous electron transfer apparatus of the bacterial cell wall either makes contact directly with the azo dye substrate

simulation. **F** Eigenvalue rank plot with reference to the percent proportion of variance

or interacts circuitously to the cell surface redox mediator (Sreelatha et al. [2016](#page-9-33)). Redox mediator compounds with small molecular weight have the capability to act as electron carriers among the outer membranous NADH-dependent azoreductase and azo dye (Sreelatha et al. [2016](#page-9-33)). Bacteria may synthesize redox mediators during substrate process-ing or these are added superficially (Russ et al. [2000](#page-9-30)). Dye reduction is hindered if the environment is aerobic as the reduced mediator is oxidized instead of azo dye. Cytoplasmic reducing enzymes supply electrons to aid redox mediators in the chemical redox process, which ultimately leads to the azo dye reduction in the cell supernatant (Xu et al. [2016](#page-10-7); Rathod et al. [2017](#page-9-34)). This explanation seemed to ft in case of sulphonated CR dye as the degradation was reduced in aerobic conditions. Additionally, we also utilized PSORTb server for subcellular localization prediction and the enzyme was predicted to be cytoplasmic.

 $250$ 



 $\mathcal{C}$ 

<span id="page-7-0"></span>**Fig. 6 A** Comparative root-mean-square displaced plot (of C-alpha atoms) of CR bound and unbound azoreductase of *Staphylococcus caprae*. **B** Overlaid structures at 1, 20, 60, 80 and 100 ns of simulation, showing altered position of CR. **C** RMSD of frames correspond-

ing to respective simulation time, with varied ligand position shown at frst frame (1 ns of simulation), second frame (20 ns of simulation time), 600th frame (60 ns of simulation time) and 800th frame (80 ns of simulation time)

A detailed computational analysis for structure prediction, molecular docking and displaced resides after docking was conducted. Since it is time-consuming and difficult to acquire experimental structures for every protein of interest from X-ray crystallography and techniques like NMR (Wei et al. [2009](#page-10-8)), homology modelling offers handy structural models for spawning hypotheses regarding a protein's function and paving way for additional experimental work. Homology models are also helpful for deducing qualitative facets concerning the biochemistry and specifc residues conservation of query sequence, and then, these hypothesized inferences can be used for experimental testing. For instance, spatially arranging conserved residues can be used for inferring if a certain arrangement stabilizes or destabilizes the folding and whether the conserved residue merely adds to the binding of a tiny molecule or promotes alliance with another nucleic acid or protein (John et al. [2011\)](#page-9-35). Protein ligand docking studies can be harnessed for dye degradation prediction by azoreductase (Patel et al. [2021\)](#page-9-36) and was implemented for this study. Several studies have reported docking of azo dyes with laccase or azoreductase (Sarkar et al. [2020](#page-9-13); Krithika et al. [2021;](#page-9-37) Mishra et al. [2023](#page-9-38)), but to the best of our knowledge, no study on *Staphylococcus* specie interaction with azoreductase exists to date. Previously, Basharat and Yasmin predicted azo dye binding with azoreductase of *Alcaligenes* sp. and found hydrogen and ionic bonds between CR and azoreductase. Both bonded and non-bonded interactions were observed for our analysis, with a Pi interaction in addition to hydrogen and ionic bonds (Basharat and Yasmin [2022](#page-9-39)). It would be interesting to explore if redox mediators are synthesized by *Staphylococcus caprae* MB400 as we did not add anything externally and MOE 2D plot showed that electron transfer seemed to occur with two residues Lys65 and Tyr124. Overall, a favourable binding was observed as MM/PBSA values of azoreductase decreased after binding to CR and this value was even lower  $(-17.62)$  than the one obtained for *Alcaligenes faecalis* azoreductase bound with CR (− 17.52) (Basharat and Yasmin [2022\)](#page-9-39).

MD simulation results complemented the docking analysis. RMSD of the azoreductase revealed good binding and trajectory analysis through PCA plotting captured motion fuctuation not exceeding 35%. This indicates that the overall motion or conformational change in the system is relatively stable, with smaller, more subtle motions or changes captured by PC2 and PC3. However, caution must be exercised when interpreting the results, as limitations in the accuracy of the force felds used in MD simulations and the approximations made during the simulation process can afect the reliability of the results. Normal mode analysis also has some limitations as it is based on the assumption that the molecule vibrates harmonically around its equilibrium conformation and is able to predict the low-frequency modes of motion that correspond to small amplitude vibrations. It cannot predict large-amplitude or anharmonic motions and does not account for solvent effects. Thus, we tried to boost our analysis by adding both techniques to study motion of atoms but limitations persist. Our study adds to the literature as no study on CR binding with *Staphylococcus* spp. exists that utilizes docking and dynamics simulation to explain the binding mechanism. Apart from giving mechanistic insights, our findings have the potential to be extended to other azoic dyes and facilitate researchers in gaining a deeper understanding of the mechanism of action of azoreductase enzymes. Additionally, this study sheds light on the substrate preference of azoreductase in *Staphylococcus caprae* and can serve as a basis for designing more efective bioremediation strategies for the removal of azo dyes from the environment. Hence, this analysis advances our knowledge on the molecular aspects on the interaction of sulphonated azo dyes with enzymes and integral role of reductases in environmental clean-up. It is hoped that this information would provide a better understanding of the molecular mechanisms, involved in catalysis and a heuristic basis for predicting the catalytic residues in related enzymes. This study could be extended for other azoic dyes and facilitate researchers in better understanding of azoreductase enzyme mechanism. The use of computational methods in studying the interaction of azo dyes with azoreductase enzymes has the potential to contribute signifcantly to our understanding of biodegradation processes and the development of more sustainable technologies for environmental remediation.

## **Conclusions**

It is concluded from present study that *Staphylococcus caprae* MB400 has potential to be utilized for reduction and detoxifcation of CR. However, the decolourization is dependent on diferent factors like concentration of dye, pH and temperature of environment. This study also indicates that catalytic site made up of specifc identifed amino acid residues plays an important role in dye degradation through azoreductase enzyme. This information could be of importance in designing mutants and expression cloning of this azoreductase in model organisms of interest. Impact of redox co-factors like NAD and FAD could also be explored. The displacement analysis for C-alpha chain of the protein validated our fndings that the most displacement was occurring in regions where residues were binding with the dye. These fuctuations are the hallmark of enzyme–substrate energy and structure change. With increasing availability of geometrical and computational methods, such analysis can be conducted in a swift manner to authenticate the interactions of enzyme binding with ligand.

**Supplementary Information** The online version contains supplementary material available at <https://doi.org/10.1007/s00203-023-03591-z>.

**Author contributions** AY and ZB contributed to conceptualization; ZB was involved in methodology, data curation and writing—original draft preparation, and provided software; SA and ZB contributed to validation and formal analysis; SA was involved in investigation; and AY contributed to resources, writing—review and editing, supervision and project administration. All authors have read and agreed to the published version of the manuscript.

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**Data availability** All the data used in this manuscript is quoted as accession number or valid identifer and is within the manuscript.

#### **Declarations**

**Conflict of interest** The authors declare no confict of interest.

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