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# Graph theoretical network analysis, *in silico* exploration, and validation of bioactive compounds from *Cynodon dactylon* as potential neuroprotective agents against α-synuclein

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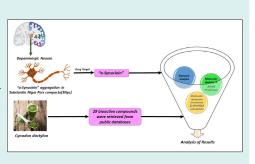
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# Abstract

**Introduction:** Parkinson's disease (PD) is a chronic, devastating neurodegenerative disorder marked by the death of dopaminergic neurons in the midbrain's substantia nigra pars compacta (Snpc). In alpha-synuclein ( $\alpha$ -Syn) self-aggregation, the existence of intracytoplasmic inclusion bodies called Lewy bodies (LBs) and Lewy neurites (LNs) causes PD, which is a cause of neuronal death. **Methods:** The present study is aimed at

finding potential bioactive compounds from



*Cynodon dectylon* that can degrade  $\alpha$ -Syn aggregation in the brain, through *in silico* molecular docking investigations. Graph theoretical network analysis was used to identify the bioactive compounds that target  $\alpha$ -Syn and decipher their network as a graph. From the data repository, twenty-nine bioactive chemicals from *C. dactylon* were chosen and their structures were retrieved from Pubchem. On the basis of their docking scores and binding energies, significant compounds were chosen for future investigation. The *in silico* prediction of chosen compounds, and their pharmacokinetic and physicochemical parameters were utilized to confirm their drug-likeness profile.

**Results:** During molecular docking investigation the bioactive compounds vitexin (-7.3 kcal.mol<sup>-1</sup>) and homoorientin (-7.1 kcal.mol<sup>-1</sup>) showed significant binding energy against the  $\alpha$ -Syn target protein. A computer investigation of molecular dynamics simulation study verifies the stability of the  $\alpha$ -Syn-ligand complex. The intermolecular interactions assessed by the dynamic conditions indicate that the bioactive compound vitexin has the potency to prevent  $\alpha$ -Syn aggregation.

**Conclusion:** Interestingly, the observed results indicate that vitexin is a potential lead compound against  $\alpha$ -Syn aggregation, and *in vitro* and *in vivo* studies are warranted to confirm the promising therapeutic capability.

# Introduction

Parkinson's disease (PD) is a complex devastating neurodegenerative illness that is the second most prevalent movement disorder, next to Alzheimer's disease (AD) in persons over the age of  $65.^{1}$  It affects 1-2 percent of people in the 65-69 age range and its incidence has risen by 1%-3% in those over the age of 80.<sup>2</sup> According to a World Health Organization (WHO) study, PD affects approximately 6.1



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million individual's worldwide.3 There are two kinds of impaired behaviors that develop in people with PD: motor and non-motor impairments. Tremors, muscle stiffness, and bradykinesia are the most prevalent motor deficits. Cognitive decline, autonomic impairment, rapid eye movement, behavioral sleep problems, painful cramps, constipation, and other behavioral abnormalities are examples of non-motor impairments.<sup>4</sup> PD is connected to the death of dopaminergic neurons in the substantia nigra pars compacta (Snpc), which is situated in the midbrain's basal ganglia and is responsible for transmitting signals to the spinal cord thereby controlling muscular contraction, addiction and coordinating movement.5 The loss of dopaminergic neurons in Snpc leads to the formation of intracytoplasmic inclusions called as Lewy bodies (LBs) and Lewy neurites (LNs) that contain alpha-synuclein (a-Syn) which causes neuronal cell death.<sup>6</sup>

α-Synuclein (14.5 kDa, 140 amino acids), is an intraneuronal and intraglial protein that controls neurotransmitter release.<sup>7</sup> The structure of α-Syn reveals the existence of three domains: the N-terminal domain, a non-amyloid-beta plaque component and the C-terminal domain.8 a-Syn is believed to be present as an intrinsically disordered monomer or helically folded tetramer in its natural state.9 On the other hand, at the neuropathological level, the  $\alpha$ -Syn protein misfolds and accumulates in the brain through protein aggregation, causing neuronal cell damage.<sup>10,11</sup> A53T point mutation on chromosome 4q21-23 was originally discovered as the connection between PD and  $\alpha$ -Syn in the year 1996. The family type of PD is affected by a mutation in the  $\alpha\text{-Syn}$  gene.  $^{12,13}$ In autosomal dominant PD patients, the  $\alpha$ -Syn gene is linked to the PARK1 locus on chromosome 4q21.14 In addition, four mutations in PD have been discovered so far: A30P, E46K, H50Q and G51D.15 All these mutations cause an increase in the rate of aggregation, a change in the oligomeric state or a reduction in the normal tetramer: monomer ratios, allowing these alterations to occur.<sup>16</sup> There is no secondary structure in the natively unfolded state of  $\alpha$ -Syn. Changes in the environment such as agitation, ionic strength and pH, make amyloid-like fibrils and a-Syn aggregates.<sup>17</sup> a-Syn, on the other hand, is more cytotoxic than amyloid proteins, which produce amyloid-like fibrils.18 By targeting α-Syn, it is possible to inhibit protein aggregation or breakdown in the treatment of PD. Levodopa is a dopamine replacement medication used to treat PD. Levodopa induces the production of dopamine, which sends messages between regions of the brain and nerves to efficiently regulate bradykinetic movement.19 While this medication has been used for a long time, it has caused various adverse effects such as fluctuations, dyskinesias, toxicity and effectiveness loss. Furthermore, present treatment methods mostly concentrate on symptom management and postponing the disease's development rather than preventing it.<sup>20</sup> Interestingly, metabolites of plants have been shown to

exhibit neuroprotective benefits. Tobacco, coffee, *Mucuna* pruriens, green tea, *Ginkgo biloba*, *Panax ginseng*, *Curcuma* longa, Bacopa monnieri and Salvia officinalis are just a few examples.<sup>21</sup>

The discovery of plants having antioxidant properties has received a lot of interest recently. In this view, bioactive chemicals from Cynodon dectylon (Family: Poaceae) were selected for evaluating their neuroprotective effects and other movement problems in this study.<sup>22</sup> Carbohydrates, proteins, calcium, iron, potassium, phosphorus, betacarotene, cynodine, triticin, furfural, levoglucosenone and other nutrients are abundant in C. dactylon.<sup>23</sup> The metabolites are used in the treatment of cough, cancer, snakebites, kidney stones, skin illnesses, bronchitis, asthma and neurological disorders in traditional medicine.<sup>24</sup> Furthermore, many studies have shown that C. dectylon extract has potential antioxidant capabilities for neuroprotective benefits.<sup>22,25</sup> Therefore, this study was designed to analyze protein aggregation in the brain by targeting the α-Syn. Using graph theoretical network analysis, we build the signaling network of genes implicated in the a-Syn protein. The network that was created has been utilized to identify the optimal medication target for successful neuroprotection. The binding effect of the identified bioactive chemicals with the specified target was predicted using molecular docking. The pharmacokinetic (absorption, distribution, metabolism, and excretion) toxicity properties of the chosen bioactive chemicals were also studied. The molecular stability and binding mechanisms of the chosen bioactive molecules with a-Synuclein protein were investigated using molecular dynamics (MD) simulation as well.

# Materials and Methods Network analysis

The protein signaling network of (HSA: 05012) Homo sapiens was screened using graph theoretical network analysis (Cytoscape software 3.7.1) to find the influential genes involved in the target protein (derived from the Kyoto Encyclopedia of Genes and Genomes (KEGG) database).<sup>26,27</sup> In the present research, the  $\alpha$ -Syn signaling network was recreated as a graph, containing several entities of genes, proteins (nodes) and their connections (edges). The network includes one node and 134 edges, as shown in Fig. 1, based on centrality characteristics such as degree, proximity, eccentricity, eigenvector, and radiality. The beginning value of all measurements, as well as important nodes in the network organisation has been shown using the measured values of degree (11), proximity (0.0418), eccentricity (0.6216), eigenvector (0.06054), radiality (61.29496) and stress (4914) (Supplementary file 1, Table S1).

# Protein receptor preparation

The crystal structure of α-Syn, PDB entry ID: 1XQ8, was downloaded and utilized as a target protein from

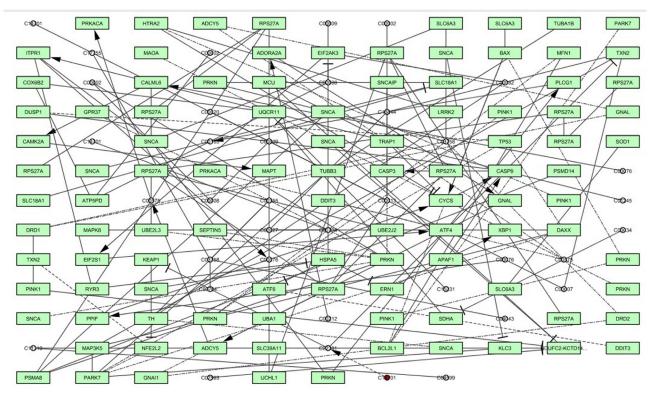


Fig. 1. The α-synuclein signaling network was developed through graph theoretical network analysis using Cytoscape software 3.7.1.

the RCSB Protein Data Bank (PDB: http://www.rcsb. org/pdb). Before the molecular screening, optimize the protein structure by adding missing residues through Swiss-PDB Viewer v4.1.0's protein process tool.<sup>28</sup> The file was given the name target.pdb and was stored for future investigation. The protein of interest was then prepared using the Discovery studio visualizer 2020 (BIOVIA). All the water molecules occupying the protein were examined and eliminated. The ligands and ions that were bound were also removed. PDB proteins are devoid of hydrogen atoms in general. As a consequence, hydrogen atoms were added to the protein to give it a more conventional feel. Optimization and minimization techniques were employed to make the target protein ready for docking.

# **Preparation of ligands**

The Indian Medicinal Plants, Phytochemistry and Therapeutics (IMPPAT) database contains twentynine bioactive chemicals from *C. dactylon.*<sup>29</sup> For virtual screening, the 3D SDF structures of identified bioactive components were acquired from the chemical database PubChem (http://pubchem.ncbi.nlm.nih.gov).

# Molecular docking

The AutoDock Vina program included in the PyRx software was used to perform molecular docking calculations of the selected bioactive molecules from *C. dactylon* with the target protein,  $\alpha$ -Syn.<sup>30</sup> The protein-ligand interaction profiler (https://plip-tool.biotec.tu-dresden.de/plip/web/plip/index) was used to analyze the

active site in the target and the resulting receptor protein was imported into the workspace. Using PyRx software, polar hydrogen atoms and Kollman partial charges were added to the three-dimensional structure of the protein. AutoDock Vina program estimated the energy affinity values of up to 10 distinct docking sites for each ligand. The ligand conformation at the active binding site was used to determine the complex affinity energies, with the RMSD between the original and subsequent docked structures taken into account. The Discovery Studio Visualizer, which provides information on compounds and interaction graphics (2D and 3D), was used to estimate information on hydrogen bonds and noncovalent interactions for each ligand-protein complex.

# Physicochemical and ADME properties prediction

Pharmacokinetic (absorption, distribution, metabolism, and excretion) and physicochemical features are critical in the drug identification of new treatments since many suggested compounds fail in the development phase. The SwissADME online tool was used to examine molecular weight, molar refractivity, solubility, bioavailability, bioavailability radar map, egg-boiled plot, brain permeation and human gastrointestinal absorption properties for the selected bioactive substances (https:// www.swissadme.ch).<sup>31</sup>

# **Toxicity prediction**

Small molecule toxicology prediction is crucial for anticipating the safety or hazardous profile of proposed bioactive substances before they are physiologically appropriated. As a consequence, to predict toxicity, and carcinogenicity profiles of the selected bioactive compounds, the canonical SMILES (simplified molecularinput line-entry system) of the selected bioactive compounds were uploaded to the web-based server called pkCSM-pharmacokinetics (http://biosig.unimelb.edu.au/ pkcsm/prediction).<sup>32</sup>

# Molecular dynamics simulation

The MD simulation is a useful tool in current molecular modeling techniques for understanding macromolecular structure-to-function correlations. MD modeling was used to examine the binding stability, conformation, and interaction mechanisms between the chosen bioactive compounds (ligands) and protein α-Syn. Using GROMACS 2019.2 software, the best bindingfree energy of ligand-a-Syn complex files was chosen for MD simulation investigations.<sup>33-35</sup> The topology of the selected bioactive compounds (ligand) was retrieved from the PRODRG website.<sup>36</sup> All of the complex systems were prepared as previously described. In MD simulation, the initial vacuum was lowered using the steepest descent approach for 5000 steps. Using a simple point charge (SPC) water model, the complex structure was solvated in a cubic periodic box of 0.5 nm. After then, enough Na<sup>+</sup> and Cl<sup>-</sup> counter ions were injected to keep the salt concentration in the complex system at 0.15M. From the NPT (Isothermal-Isobaric, constant number of particles, pressure, and temperature) equilibration, each complex was assigned a simulation time of 50 ns for the final run. Using the internet server "WebGRO" for macromolecular simulations (https://simlab.uams.edu/), the root mean square deviation (RMSD) and root mean square fluctuation (RMSF) trajectories structure was executed in the GROMACS program.

# Molecular mechanics Poisson–Boltzmann surface area (MMPBSA) calculation

The protein-ligand binding free energy of each complex was calculated using the MMPBSA technique. The g\_ mmpbsa tool created for GROMACS was used to calculate the binding free energy.<sup>37,38</sup>

# Density functional theory (DFT)

The Gaussian 03W program and the Gauss View molecular visualization tools were used to perform computational calculations of the selected bioactive compounds.<sup>39</sup> Using a 6-311G (d,p) basis set, the DFT/Becke-3–Lee–Yang–Parr (B3LYP) approach was utilized to optimize the molecular structures of the chosen bioactive compound. Using the optimized structures, the frontier molecular orbital energies of both compounds (lowest unoccupied molecular orbital [ELUMO], highest occupied molecular orbital [EHOMO], and their energy gap [Eg]) were computed. Gauss View, a molecular visualization tool,

was used to display the created molecular orbital energy diagrams of the selected bioactive chemicals.

# Results

# Bioactive compounds retrieval and preparation

The IMPPAT database was searched for the available bioactive chemicals of the selected plant from *C. dactylon*. Table 1 shows a list of twenty-nine key bioactive chemicals and their structures found in *C. dactylon* were retrieved from the database.

## Molecular docking

The structure-based molecular docking method was used to evaluate the efficacy of identified putative bioactive chemicals against the  $\alpha$ -Syn protein which could offer neuroprotective effects. Twenty-nine bioactive chemicals

Table 1. Bioactive compounds from Cynodon dectylon and their binding affinity against  $\alpha\text{-Syn}$ 

Ligand	Compound Id	Docking score (kcal.mol <sup>-1</sup> )			
Vitexin	CID:5280441	-7.3			
Homoorientin	CID:114776	-7.1			
Friedlein	CID:244297	-6.8			
Beta-carotene	CID:5280489	-6.6			
Orientin	CID:5281675	-6.4			
Triterpenoids	CID:71597391	-6.3			
Ergonovine	CID:443884	-6.3			
Luteolin	CID:5280445	-6.3			
Ergometrinine	CID:5486180	-6.2			
Phytosterols	CID:12303662	-6.2			
2"-O-glycosylisovitexin	CID:101698596	-6.2			
Arundoin	CID:12308619	-6.2			
Apigenin	CID:5280443	-6.1			
Tricin	CID:5281702	-5.6			
Beta-Ionene	CID:53249763	-4.9			
2-Coumarinate	CID:5280841	-4.9			
Triglochinin	CID:5281124	-4.8			
Ferulic acid	CID:445858	-4.5			
Phenyl acetaldehyde	CID:998	-4.1			
Syringic acid	CID:10742	-4.1			
Vanillic acid	CID:8468	-4.0			
L-ascorbic acid	CID:54670067	-3.9			
Phytol	CID:145386	-3.9			
Palmitic acid	CID:985	-3.6			
Docosanoic acid	CID:8215	-3.6			
Hexadecanal	CID:984	-3.5			
Tritriacontane	CID:12411	-3.4			
Furfuryl alcohol	CID:7361	-3.2			
Furfural	CID:7362	-3.1			

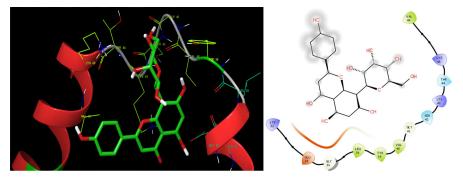
were docked against the α-Syn protein using AutoDock Vina tools in PyRx software. Thirteen bioactive metabolites out of 29 have a greater binding affinity (-6 kcal.mol<sup>-1</sup>) with the target protein and the results are presented in Table 1. Two of the bioactive compounds, vitexin (-7.3 kcal.mol<sup>-1</sup>) and homoorientin (-7.1 kcal.mol<sup>-1</sup>) which exhibited higher binding energy values were selected for further studies. The intermolecular interactions between the α-Syn protein with vitexin (Fig. 2), homoorientin (Fig. 3), and other compounds are presented in Table S2. The Maestro 11.7 version of the Schrodinger suite was used to depict the interactions between the ligands (vitexin and homoorientin) and the  $\alpha$ -Syn protein. Vitexin (VIT) created three hydrophobic contacts with LYS43A (3.68 Å), VAL48A (3.68 Å) and VAL48A (3.73 Å), while LYS32A (2.68 Å), VAL40A (3.06 Å) and LYS45A (3.08 Å) formed three hydrogen bonds. Homoorientin (HOM) formed four hydrogen bonds with LYS32A (3.15 Å), GLU35A (2.19 Å), GLY36A (2.42 Å), LYS43A (2.91 Å) and one  $\pi$ -Stacking with TYR39A (5.43 Å).

# In silico prediction of physicochemical and ADME properties

SwissADME (http://www.swissadme.ch/) online tool was used to evaluate the pharmacokinetics (ADME) and physicochemical characteristics of the bioactive molecules

from C. dactylon and the results are shown in Table 2 and Table S3. As the data in Table 2 indicates, the molecular weights of VIT and HOM are 432.38 g.mol<sup>-1</sup> & 448.38 g.mol-1 respectively and this was found to contradict Lipinski's rule of five as the molecular weights are higher (MW >350). The two bioactive molecules, VIT and HOM have a polar surface area of 181.05 Å<sup>2</sup> and 201.28 Å<sup>2</sup> respectively. The anticipated findings also revealed that the bioactive chemicals VIT and HOM had a lower rate of gastrointestinal (GI) absorption in humans. The greater the amount of H-bonds, the more likely they are engaged in protein-ligand interaction. As a result, VIT, the discovered bioactive molecule, has a higher probability of becoming a drug-relevant candidate with neuroprotective potential. Both the chosen bioactive molecules and the conventional drug. The synthetic accessibility scores were determined to be 5.12 (VIT), and 5.04 (HOM), which showed that the bioactive molecules, VIT and HOM are difficult to manufacture.

Fig. 4 depicts a bioavailable radar map of drug-like properties of the selected chemicals VIT and HOM. The pink zone within the hexagon signifies the optimal range for the compounds. The drug-like compound's authorized range was unsaturation (INSATU): rotatable bonds (FLEXI): no more than 9 rotatable bonds, molecular weight (SIZE): between 150 and 500 g.mol<sup>-1</sup>, polar



**Fig. 2.** Representation of intermolecular interaction between the bioactive compound vitexin with α-Syn protein. The left side shows three-dimensional and the right side shows the two-dimensional structure of protein-ligand interaction.

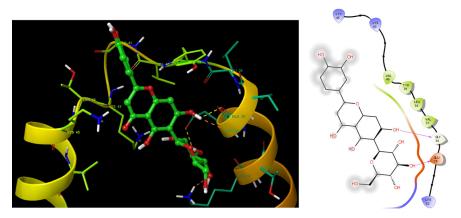


Fig. 3. Representation of intermolecular interaction between the bioactive compound homoorientin with α-Syn protein. The left side shows three-dimensional and the right side shows the two-dimensional structure of protein-ligand interaction.

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Parameter	Vitexin	Homoorientin
Formula	$C_{21}H_{20}O_{10}$	$C_{21}H_{20}O_{11}$
MW (g.mol <sup>-1</sup> )	432.38	448.38
Number of heavy atoms	31	32
Number of aromatic heavy atoms	16	16
Fraction Csp3	0.29	0.29
Number of rotatable bonds	3	3
Number of H-bond acceptors	10	11
Number of H-bond donors	7	8
Molar refractivity	106.61	108.63
TPSA (Ų)	181.05	201.28
Solubility class	Soluble	Soluble
Gastro Intestinal absorption	Low	Low
Blood Brain Barrier crossing	No	No
Violation of Lipinski's rule of five	1	2
Bioavailability score	0.55	0.17
Synthetic accessibility	5.12	5.04

 Table 2. In silico predicted physicochemical and ADME parameters of vitexin, and homoorientin

surface area (POLAR): between 20 and 130 g.mol<sup>-1</sup> and polar surface area (POLAR): between 20 and 130 Å<sup>2,40</sup> The red slanted hexagon off-shoot of the vertex displays drug-like properties of the bioactive chemicals VIT and HOM (Fig. 4). In addition, using an egg-boiled model, the pharmacokinetic characteristics of both the bioactive chemical VIT and HOM were examined. The eggboiled model proved useful in predicting two important pharmacokinetic characteristics at the same time, namely, passive gastrointestinal absorption (HIA) and blood-brain barrier (BBB) penetration.<sup>29</sup> The chemical contained in the yolk (i.e., yellow area) indicates very likely BBB permeation, whereas albumin (i.e., white region) represents highly possible HIA absorption in the eggshaped organization plot. The bioactive components, VIT and HOM were detected outside the boiled egg in Fig. 5, indicating poor gastrointestinal absorption. The bioactive

molecules VIT and HOM have significant potential to be drug-like agents for neuroprotective treatment, as indicated by the aforementioned expected findings.

# **Toxicity prediction**

Using the pkCSM-pharmacokinetics web-based platform, *in silico* toxicity prediction of the selected bioactive molecules, VIT, and HOM was conducted. Table 3 and Table S4 depicted the results of the predictions for AMES toxicity, drug-induced hERG toxicity,  $LD_{50}$  (median fatal dosage), hepatotoxicity, skin sensitization, *Tetrahymena pyriformis* (TP) toxicity, and minnow toxicity of selected (higher binding energy) and other bioactive compounds of *C. dactylon*, respectively. The results found that selected bioactive compounds VIT and HOM were no unfavorable effects such as hepatotoxicity, carcinogenicity, and skin sensitization. The  $LD_{50}$  specifies the instant or acute toxicity of molecules that were determined to be the most effective in the exploration.

# Molecular dynamics

While protein-ligand docking is extensively used and effective, it only offers a snapshot depiction of the ligand's binding posture at the receptor's active area. MD must be used to mimic the dynamics of atoms in the system as a function of time while also integrating Newton's equations of motion.<sup>30</sup> The results of 100-ns MD simulations were analyzed for two complexes produced from docking studies against  $\alpha$ -Syn: VIT, and HOM. To investigate the stability and fluctuations of these complexes, MD trajectory analysis was performed to calculate the RMSD (Root Mean Square Deviation), RMSF (Root Mean Square Fluctuation), RGY (Radius of gyration), and SASA (Solvent Accessible Surface Area).

The RMSD is an important metric for analyzing the equilibration of MD trajectories and ensuring the stability of complex systems during simulation. To evaluate structural conformation changes, the RMSD of the protein backbone atoms was plotted vs time. With no substantial differences in the results, a stable conformation was

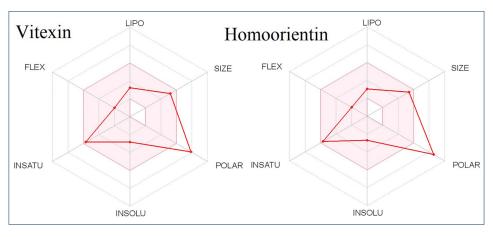


Fig. 4. The oral bioavailability radar map of the bioactive molecule vitexin, and homoorientin.

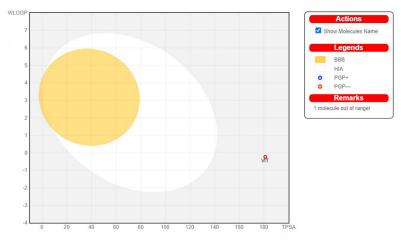


Fig. 5. The EGG-BOILED model for vitexin and homoorientin.

attained between 31 and 100 ns (Fig. 6A). The test VIT complex's backbone RMSD ranged from 3.6 to 30 ns. With no substantial differences in the data, the stable conformation was attained in 31-100 ns (Fig. 6A). The test HOM complex had backbone RMSD variations ranging from 3.6 to 40 ns. With no substantial fluctuations in the measurements, a stable conformation was attained in 41-100 ns (Fig. 6A). This suggests that throughout the early stages of the simulations, the protein undertook small structural changes in all of the complexes.

When modeling the stability and flexibility of complex systems, the RMSF is a crucial metric to consider<sup>41</sup>. When a target protein interacts with a ligand, the RMSF was utilized to see how the behavior of its amino acid residues changed. The C atoms' RMSF values were considered and plotted versus the residues (Fig. 6B).

The VIT complex fluctuated a little bit during the simulation time shown in the image, but the HOM complex fluctuated a lot. These results reveal that the binding of the VIT ligand does not affect the protein's flexibility.

The gyration radius (RGY) of complicated systems was also examined. The RMS distance between the atoms of the protein and the rotation axis is denoted by RGY. It is one of the most important parameters for determining the complete change in the compactness and dimensions of the protein structure over time.<sup>42</sup> Higher RGY values imply a less compact and flexible protein, while low RGY values indicate a compact and rigid protein. RGY values of protein backbone atoms were plotted against time to evaluate differences in structural compactness. Between 31 and 100 ns, there were no notable differences and the value of 2 nm remained fairly constant. After VIT binding, the backbone RGY values dropped 35 ns. Between 36 and 100 ns, there were no significant changes in duration and the value of 1.7 nm remained nearly constant. Following HOM binding, the backbone RGY values dropped by 40 ns. Between 41 and 100 ns, there were no significant changes and the value of 1.6 nm remained relatively constant (Fig. 6C). The compounds cause no significant structural changes in the protein, according to the results of the entire investigation.

A Solvent Accessible Surface Area (SASA) analysis was also performed on all of the complexes.<sup>43</sup> SASA is an important parameter for determining the degree of receptor exposure to the surrounding solvent molecules during simulation. In general, ligand binding can impact the structural integrity of the receptor, affecting the region in contact with the solvent. The surface area changes in protein SASA measurements were plotted against time.

Except for a few periods throughout the simulation, minute alterations were seen throughout. The average value of SASA was found to be 85 nm<sup>2</sup>. The VIT complex showed a decrease in values until 35 ns in its trajectory. Around 80 nm<sup>2</sup> was found to be the average SASA value. Until 45 ns, the HOM complex's trajectory showed a decrease in values. Except for a few periods throughout the simulation, minute alterations were seen throughout. The average SASA value was 83 nm<sup>2</sup>, as shown in Fig. 6D. According to the study, the surface area of protein in all complexes shrank during the simulation.

The MD trajectories were analyzed to determine

Table 3. Toxicity profile of top scored bioactive molective
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Compound	AMES toxicity	Maximum tolerated dose (human)	hERG inhibition	LD50	Hepatotoxicity	Carcinogenicity	Skin Sensitisation	<i>T. pyriformis</i> toxicity	Minnow toxicity
Vitexin	Yes	1.089	No	2.996	No	No	No	0.285	2.865
Homoorientin	Yes	0.7	No	2.963	No	No	No	0.285	3.579

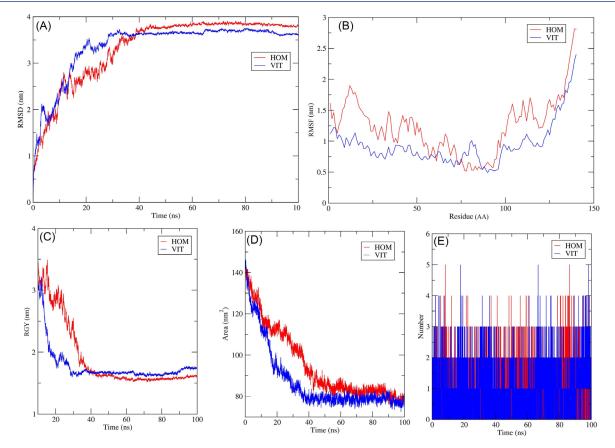


Fig. 6. Time evaluation of RMSD plots for MD simulation of VIT (Blue) and HOM (Red) (A); Time evaluation of RMSF plots for MD Simulation. Chain of  $\alpha$ -Syn-VIT (Blue) and  $\alpha$ -Syn-HOM (Red) (B); Time evaluation of Radius of gyration plot for MD Simulation of VIT (Blue) and HOM (Red) (C); Time evaluation of SASA plots for MD Simulation of VIT (Blue) and HOM (Red) (D); Stability of intermolecular hydrogen bonding plot for MD Simulation of VIT (Blue) and HOM (Red).

the number of hydrogen bond formations throughout the simulation and the results are shown in Fig. 6E to investigate the ligands' binding energy to the target protein. Almost, three hydrogen bonds were established regularly throughout the simulation, showing the stability of the complex. The steadiness in making three hydrogen bonds with a maximum of five bonds for the VIT complex was maintained at specific time intervals. The HOM complex was found to be consistent in forming two hydrogen bonds with a maximum of four bonds at various time intervals. As can be seen, the top phytochemicals bind to the target protein with greater affinity.

## Binding free energy analysis / MM/PBSA

The binding free energy (G bind) for VIT and HOM complexes was determined using the MM/PBSA technique for the final 20 ns (80-100 ns) of simulated trajectories with dt 1000 frames. VIT and HOM complexes each had a  $\Delta$ G bind of -126.3011.215 kJ.mol<sup>-1</sup> and -114.2717.66 kJ.mol<sup>-1</sup>, respectively. These low negative free binding energies indicate that the test ligands have a strong affinity for binding to  $\alpha$ -Syn protein. The RMSD, RMSF, RGY, and SASA were used to verify the complexes and the lead complex Vitexin was determined to be stable throughout the simulations.

# Density functional theory analysis

In that HOMO is a crude estimate of a compound's electron-donating capacity, the frontier-orbital energies (highest occupied molecular orbital (HOMO) & lowest unoccupied molecular orbital (LUMO)) of bioactive compounds play a major influence on bioactivities.<sup>26</sup> The energies and HOMO–LUMO energy gap of selected bioactive chemical vitexin and homooreintein were measured by B3LYP level using 6-311G (d, p) basis set and the HOMO–LUMO diagram of vitexin, and homooreintein was given in Table 4. The HOMO-LUMO energy gap values of the bioactive molecule vitexin were 0.12863 and for homooreintein were 0.12543. The findings of the energy gap values revealed that vitexin, homooreintein are very stable in nature.

# Discussion

The most common reason for the pathological condition of dopaminergic neurons of PD is an abnormal aggregation of  $\alpha$ -Syn protein in the form of Lewy bodies and Lewy neuritis in neurons.<sup>44</sup> Oxidative stress plays a critical role in the degradation of dopaminergic neurons in PD.<sup>45</sup> Several studies were shown that bioactive compounds from plants have neuroprotective effects against  $\alpha$ -Syn aggregation and oxidative stress on PD.<sup>46,47</sup> Hence, the

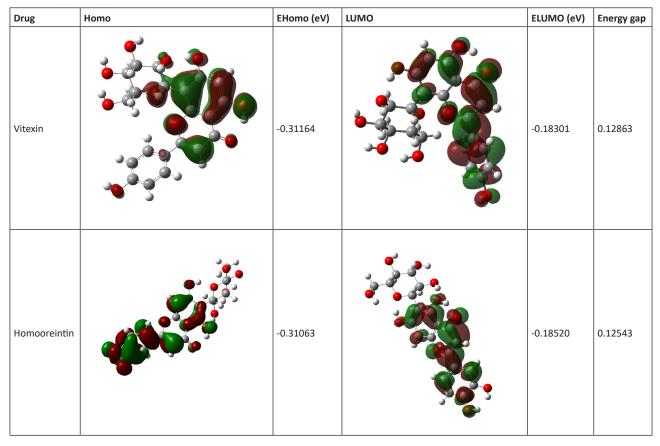


Table 4.  $E_{HOMO}$  and  $E_{LUMO}$  and  $\Delta E$  values of Vitexin and Homoorientin

objective of this present study was to find out the effective neuroprotective agents from a plant source to prevent  $\alpha$ -Syn protein aggregation that occurs in the midbrain's Snpc. Among the medicinal plants, *C. dactylon* possesses enormous medicinal valued bioactive compounds that are commonly used as antioxidants and neuroprotective purposes.<sup>48</sup> *In silico* molecular docking tools have been used to narrow down these medicinally valued bioactive compounds, particularly for the prevention of  $\alpha$ -Syn protein aggregation in a neuron.

In silico molecular docking helps in accelerating the drug discovery process because the screening of the bioactive compounds that bind to the target protein can be predicted in a short duration. This along with in silico evaluation of pharmacokinetic, physiochemical, and pharmacodynamics properties assists in the identification of a few lead compounds that can be developed into a drug that can lead to disease prevention. In silico-based virtual screening, molecular docking, and molecular dynamics simulation experiments were employed in many studies and the results obtained were later confirmed by in vitro and in vivo activity evaluation studies.49 This upholds the value of in silico studies in the drug discovery processes. Researchers may be able to find therapeutic solutions for specific diseases by better understanding how the compounds bind to, interact with, and down or upregulate the associated proteins.

Pathway analysis, functional analysis and essentiality

prediction can help in the identification of key genes and proteins in the biomolecular networks.<sup>50</sup> In this study, a graph theoretical network was constructed with the help of centrality measures such as closeness, betweenness, eigenvector, eccentricity, stress, radiality, and a degree in order to explore the roles and responsibilities of genes, proteins and enzymes that are essential for the development of biological pathway (a-Syn protein pathway). The created network comprising of some points (nodes) linked in a pattern by a set of edges, follows the structures of actual biological systems. The re-constructed biomolecular network, α-Syn protein was recognized as an ideal drug target for neurological disease "PD". Historically, plant extracts and natural phytoconstituents were majorly utilized for drug discovery and development.<sup>51</sup> As a result, the goal of this study was to find out bioactive chemicals from C. dactylon by inhibiting  $\alpha$ -Syn aggregation in the Snpc of the midbrain. Using IMPPAT database, a total of twenty-nine phytocompounds present in C. dactylon were selected. The docking scores of the chosen phytocompounds against a-Syn protein range from -3.1 kcal.mol<sup>-1</sup> to -7.3 kcal.mol<sup>-1</sup>. Two of the compounds, Vitexin (-7.3 kcal.mol<sup>-1</sup>) and homoorientin (-7.1 kcal.mol<sup>-</sup> <sup>1</sup>) were chosen for further study because they exhibited significant binding energy. Similarly, Thangavel et al also used in silico analysis to find out effective derivatives of 7,8-dihydroxyflavone (DHF) for inhibiting a-Syn aggregation previously.11

A new drug discovery process also involves the assessment of pharmacokinetics (absorption, distribution, metabolism and excretion) pharmacodynamics, and physicochemical properties, because they are directly linked with the effectiveness of phytocompounds.52 Several highly active compounds failed during the quality control process due to unsatisfactory pharmacokinetics and toxicity properties.53 Further, biologically active phytocompounds must reach their desired target location in sufficient quantity and remain in a stable form for long enough to trigger biological reactions.<sup>54</sup> Therefore, pharmacokinetic and physicochemical properties of phytocompounds must be evaluated during the drug development stages in order to pass routine clinical investigations and be regarded as promising drug candidates. Further, the Lipinski rule of 5 methodologies appears to be a helpful tool to predict the drug-likeness properties of phytocompounds.55 Molecular weight and topological polar surface area (TPSA) have been observed under pharmacokinetic properties that govern the permeability of bioactive compounds across the biological barriers (i.e. blood-brain barrier).56 Permeability of a phytocompounds may be reduced due to higher molecular weight and lower TPSA.<sup>57</sup> Solubility impacts the absorption of phytocompounds in the body.58 The selected bioactive compounds (HOM and VIT) from this investigation show lower gastrointestinal absorption which could be attributed to the higher molecular weight of these two compounds. A few phytochemicals are known to be absorbed into the circulatory system through the small intestine, whereas others are absorbed by the colon and are believed to be transformed by the gut microbiota, and released back into the blood along with some microbial metabolites. These are known to exhibit substantial pharmacological action.59 The number of hydrogen bond acceptors/donors present in a phytochemical molecule is also known to influence their permeability. Phytocompounds that have 12 or a smaller number of hydrogen bond donor provides good permeability across the biological barriers.<sup>60</sup> The bioactive molecules evaluated in this study, VIT and HOM have 10 and 11 hydrogen bond acceptors and 7 and 8 hydrogen bond donors respectively, these results indicate the moderate permeability of biological barriers. Moreover, good oral bioavailability indicates 10 or fewer rotatable bonds of phytocompounds.<sup>61</sup> The boiled-egg analysis was carried out to establish the human intestinal absorption and blood-brain barrier permeability of identified phytocompounds.<sup>30</sup> Since both the bioactive compounds, VIT and HOM were detected outside the boiled egg (Fig. 5), these were considered to have poor gastrointestinal absorption.

In this study, all the selected phytocompounds were analyzed for pharmacokinetics and physicochemical properties, and further assessment studies were conducted based on the findings. The toxicity of phytocompounds must be determined in order to explore their unwanted

toxic effects, which can harm human beings. It is also one of the important phases in drug design and development.<sup>62</sup> The most common causes of drug failure in late-stage drug development include toxicity and serious adverse reactions.63 Studies on animal models necessary to investigate the toxic profile of phytocompounds were constrained due to the longer time taken for the studies, ethical consideration, cost, and complexity of the studies.<sup>64</sup> As a result, in silico toxicity method that uses computational tools for predicting the toxicity of identified phytocompounds is regarded as useful. The toxicity levels of chosen bioactive molecules were evaluated using in silico methods in this study. In silico analyses were used to predict the hERG (ion channel), AMES, hepatotoxicity, carcinogenicity, and skin-irritating properties of chosen drugs. VIT and HOM were found to score negatively for hERG toxicity, carcinogenicity, and skin irritation and exhibited favorable logBB values. The LD<sub>50</sub> represents the speedy or acute toxicity of the drugs that were shown to be the most effective in the study. Molecular dynamics simulation, a method for examining the physical movements of atoms and molecules,65 confirms the stability and fluctuation of a drug candidate at the active site of the target protein. The  $\alpha$ -Syn-ligand (VIT and HOM) complexes were validated by interpreting the RMSD, RMSF, RGY, hydrogen bond interactions, and SASA during the simulations.

# Conclusion

Plant extracts and plant-derived bioactive substances have traditionally been used to help suppress chronic disease, protect health, lower treatment expenses, and enhance the quality of life. a-Syn protein is a key component during the earlier stages of development of neurodegeneration in PD. The present study looked for a possible neuroprotective agent in C. dactylon that can prevent a-Syn protein aggregation. Vitexin, an unreported bioactive compound showed significant binding energy (-7.3 kcal mol-<sup>1</sup>) towards the  $\alpha$ -Syn protein among the twenty-nine compounds that were evaluated. The pharmacokinetics and physicochemical properties of vitexin were found non-toxic and drug-like. The stability of the ligandreceptor complex was examined using molecular dynamics simulation and it was discovered that vitexin with a-Syn protein complexes was stable throughout the simulation. The density functionality theory findings also revealed that vitexin is very stable in nature. Overall, the bioactive chemical vitexin from C. dactylon could be a potential lead molecule for future testing as a possible neuroprotective agent acting on a-Syn aggregation using both in vitro and in vivo assays.

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# **Research Highlights**

# What is the current knowledge?

 $\sqrt{}$  Parkinson's disease is a complex progressive neurodegenerative disorder, next to Alzheimer's disease.  $\sqrt{}$  Plants and their extracts possessing antioxidant properties has received a lot of interest recently.

 $\sqrt{Cynodon \ dectylon}$  and their extracts were traditionally used for neuroprotective effects and other motor neuron problems

# What is new here?

 $\sqrt{}$  Ideal target via graph theoretical network analysis (alphasynuclein (has: 05012)) and translate their signalling route, a network was built.

 $\sqrt{}$  Molecular dynamics simulation verified the stability of bioactive compound vitexin at the alpha-synuclein binding pockets.

 $\sqrt{}$  The density functionality theory revealed that bioactive compound vitexin was very stable in nature.

 $\sqrt{In silico}$  pharmacokinetic prediction analyse showed the druggability and safety profile of the lead compound vitexin.

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#### **Ethical Statement**

There is none to be declared.

#### **Competing interests**

The authors declare no conflict of interest in publishing this paper. This study not supported by any grant money from a pharmaceutical company or for-profit organization.

#### Authors' contribution

Conceptualization: RRR and SK; Methodology, RRR, BKK, SM, PP and SK; Validation: RRR, SRK, DNA, KSJ and SK; Formal analysis: SK, PP, KS, SM and TP; Investigation: RRR and SK; Resource: RRR and SK; Data curation: KS, RRR and SK; Writing-original draft preparation: RRR, PP and SK; Writing-review and editing: RRR, KS and SK; Visualization: RRR, KS and SK; Supervision: SK. All authors have read and agreed to the published version of the manuscript.

#### Supplementary files

Supplementary files 1 contains Tables S1-S4.

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