

Predicting Potential SARS-COV-2 Drugs - In Depth Drug Database Screening Using Deep Neural Network Framework SSnet, Classical Virtual Screening and Docking

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Timing and resources for SSnet

The SSnet model was tested on SMU Maneframe II. The GPU node is equiped with 36 accelerator nodes with NVIDIA GPUs, dual Intel Xeon E5-2695v4 2.1 GHz 18-core “Broadwell” processors, 256 GB of DDR4-2400 memory, and one NVIDIA P100 GPU accelerator. Each NVIDIA P100 GPU has 3,584 CUDA cores and 16 GB CoWoS HBM2 memory. The P100 GPU is based on the new Pascal architecture and an extremely high bandwidth (732 GB/s) stacked memory architecture. It took around 36 minutes to screen through 1 million compounds per target including the preprocessing of the data (featurization of ligands and proteins).

Introduction to Hilbert Space Filling Curve

Space filling curves are a class of curves in mathematical analysis that are used to map every point of a 1-dimensional line into every ordered-pair in 2-dimensional space. Hilbert's space filling curve is an example of such a curve. The curve is defined recursively such that with each recursion the line occupies more space, ultimately filling it after infinite recursions. A first order Hilbert curve divides a given space into quadrants whose center points are joined consecutively without repeating or intersecting the curve (similarly to the classic snake game). A second order curve further subdivides the quadrants whose centers become new points. The points are first connected within the sub-quadrants and the sub-quadrants are rotated such that the end-points of each sub-quadrant can be connected to its neighbor. This process is recursively done until the line spans the entire 2D space. In the present study, we recur this algorithm until the number of ordered-pair generated is less than or equal to the number of compounds to be mapped. A python script named plot_hill.py can be found in <https://github.com/nischal-karki/chem-hilbert-web-host/>, this script was used to generate the required dimension of 2D image for each of the datasets.

SSnet and smina scores

Top scores for both smina and SSnet

Table S1: Top Scores for SSnet and smina

| Drug name | ACE2 (open) | smina ACE2:S1 (closed) | ACE2 (closed) | ACE2 (open) | SSnet ACE2:S1 (closed) | ACE2 (closed) | Common name | Usage | Mode of Action |
|------------------|----------------|------------------------------|------------------|----------------|------------------------------|------------------|------------------------------|--|--|
| ZINC000100378061 | -10.23 ± 0.62 | -10.83 ± 0.38 | -10.00 ± 0.93 | 0.999 | 0.999 | 0.999 | Naldemedine | Opiod induced constipation | Opiod receptors |
| ZINC000003978005 | -10.23 ± 0.44 | -10.13 ± 0.58 | -10.40 ± 0.40 | 0.983 | 0.963 | 0.983 | Dihydroergotamine | Treatment of migraine disorders | Serotonine, dopamine and adrenoreceptor antagonist (RAAS related) |
| ZINC000077313075 | -9.9 ± 0.27 | -10.16 ± 0.36 | -9.93 ± 0.51 | 0.984 | 0.967 | 0.985 | Sorafenib Beta-D-Glucuronide | Cancer | Kinase inhibitor |
| DB11986 | -10.1 ± 0.67 | -10.30 ± 0.53 | -9.90 ± 0.80 | 0.978 | 0.954 | 0.979 | Entrectinib | Treatment of non-small cell lung cancer | Tropomyosin receptor tyrosine (TRK), proto-oncogene tyrosine-protein kinase ROS1, kinase and anaplastic lymphoma kinase (ALK) inhibitor. |
| ZINC000001612996 | -9.53 ± 0.29 | -9.50 ± 0.60 | -9.87 ± 0.36 | 0.976 | 0.949 | 0.977 | Irinotecan | Treatment for colorectal cancer | Antineoplastic enzyme inhibitor |
| ZINC000043195321 | -9.33 ± 0.42 | -9.90 ± 0.00 | -9.10 ± 0.53 | 0.964 | 0.926 | 0.966 | Capmatinib | Treatment of non-small cell lung cancer | Tyrosine kinase Inhibitor |
| ZINC000003781738 | -9.53 ± 0.44 | -9.47 ± 0.62 | -9.73 ± 0.44 | 0.967 | 0.931 | 0.968 | Lestaurtinib | Cancer | Tyrosine kinase inhibitor |
| ZINC00205224698 | -9.07 ± 0.51 | -9.20 ± 0.60 | -9.43 ± 0.04 | 0.993 | 0.985 | 0.993 | Fosnetupitant | Prevention of chemotherapy-induced nausea and vomiting | Neurokinin 1 (NK1) receptor antagonist |
| DB12329 | -9.13 ± 0.38 | -9.43 ± 0.38 | -9.07 ± 0.62 | 0.992 | 0.983 | 0.992 | Eravacycline | Antibiotic | β-lactamase inhibitors |
| ZINC000006716957 | -10.10 ± 0.53 | -10.57 ± 0.04 | -9.73 ± 0.58 | 0.784 | 0.628 | 0.788 | Nilotinib | Treatment for chronic myelogenous leukemia | Bcr-Abl tyrosine kinase inhibitor |
| DB15035 | -9.03 ± 0.42 | -9.30 ± 0.27 | -8.83 ± 0.58 | 0.998 | 0.995 | 0.998 | Zanubrutinib | Treatment of mantle cell lymphoma | Tyrosine kinase inhibitor |
| ZINC000022448696 | -9.16 ± 0.08 | -9.17 ± 0.09 | -9.3 ± 0.00 | 0.998 | 0.995 | 0.998 | Indinavir | Anti-viral | HIV protease inhibitor |

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Top scores with SSnet

Table S2: Top Scorers for SSnet

| Drug name | ACE2 (open) | smina ACE2:S1 (closed) | ACE2 (closed) | ACE2 (open) | SSnet ACE2:S1 (closed) | ACE2 (closed) | Common name | Usage | Mode of Action |
|------------------|----------------|------------------------------|------------------|----------------|------------------------------|------------------|----------------|--|---|
| ZINC000095551509 | -8.80 ± 0.20 | -8.97 ± 0.36 | -8.87 ± 0.36 | 0.998 | 0.999 | 0.999 | Grazoprevir | Treatment of hepatitis C | Inhibitor of NS3/4A serine protease |
| DB09078 | -7.83 ± 0.18 | -7.90 ± 0.13 | -7.80 ± 0.13 | 0.998 | 0.999 | 0.999 | Lenvatinib | Treatment of thyroid cancer | Tyrosine kinase (RTK) inhibitor |
| DB14723 | -8.37 ± 0.44 | -8.80 ± 0.13 | -8.00 ± 0.13 | 0.997 | 0.999 | 0.999 | Larotrectinib | Cancer | Tropomyosin receptor kinase (Trk) inhibitor |
| ZINC000011677857 | -8.57 ± 0.16 | -8.73 ± 0.38 | -8.67 ± 0.38 | 0.997 | 0.999 | 0.999 | Avanafil | Erectile dysfunction | Phosphodiesterase-5 inhibitor |
| DB11581 | -9.77 ± 0.38 | -9.93 ± 0.49 | -10.23 ± 0.49 | 0.997 | 0.998 | 0.999 | Venetoclax | Treatment chronic lymphocytic leukemia | BCL-2 inhibitor |
| DB08916 | -7.70 ± 0.20 | -7.70 ± 0.27 | -7.77 ± 0.27 | 0.997 | 0.998 | 0.998 | Afatinib | Treatment of metastatic non-small cell lung cancer | Tyrosine kinase inhibitor |
| DB08890 | -8.23 ± 1.78 | -7.97 ± 1.36 | -7.87± 1.36 | 0.996 | 0.998 | 0.998 | Linaclotide | Treatment of irritable bowel syndrome | Guanlylate cyclase 2C agonist |
| ZINC000001319780 | -8.17 ± 0.56 | -8.40 ± 0.53 | -8.07 ± 0.53 | 0.996 | 0.998 | 0.998 | Buprenorphine | Treatment of severe pain | Partial mu-opioid receptor agonist |
| DB13879 | -9.97 ± 0.49 | -9.80 ± 0.47 | -10.03 ± 0.47 | 0.995 | 0.998 | 0.998 | Glecaprevir | Treatment of hepatitis C | Inhibitor of NS3/4A serine protease |
| ZINC000218037687 | -9.37 ± 0.42 | -9.5 ± 0.87 | -9.73 ± 0.87 | 0.994 | 0.997 | 0.997 | Voxilaprevir | Treatment of Hepatitis C | Inhibitor of NS3/4A serine protease |
| DB00834 | -8.23 +/- 0.31 | -8.27 ± 0.36 | -8.27 ± 0.36 | 0.993 | 0.997 | 0.997 | Mifepristone | Treatment of hypercortisolism | Glucocorticoid receptor antagonist |
| ZINC000004393164 | -6.77 ± 0.18 | -6.80 ± 0.27 | -6.47 ± 0.27 | 0.993 | 0.997 | 0.997 | Aldisuren | Hypertension | Renin inhibitor (Part of RAAS) |

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Top Scores for SSnet ACE2 (open) - ACE2:S1 (closed)

Table S3: Top Scores for SSnet ACE2 (open) - ACE2:S1 (closed)

| Drug name | ACE2 (open) | smina ACE2:S1 (closed) | ACE2 (closed) | ACE2 (open) | ACE2: S1 (closed) | ACE2 (closed) | Common name | Usage | Mode of Action |
|------------------|----------------|------------------------------|------------------|----------------|-------------------------|------------------|-------------------------------|---|--|
| DB13125 | -7.00 ± 0.20 | -7.60 ± 0.73 | -7.23 ± 0.98 | 0.629 | 0.442 | 0.633 | Lusutrombopag | Treatment of thrombocytopenia | Thrombopoietin receptor (TPOR) agonist |
| DB00301 | -8.00 ± 0.47 | -7.97 ± 0.62 | -8.17 ± 0.49 | 0.607 | 0.423 | 0.611 | Flucloxacillin | Antibiotic | Beta-lactamase inhibitor |
| ZINC000030731319 | -9.30 ± 0.27 | -9.30 ± 0.40 | -9.43 ± 0.31 | 0.634 | 0.451 | 0.638 | Morphine-3-glucuronide | Metabolite of morphine | Mu and kappa opioid receptors agonist |
| ZINC13682481 | -7.87 ± 0.24 | -8.00 ± 0.13 | -7.73 ± 0.31 | 0.637 | 0.454 | 0.641 | Elvitegravir | Treatment of HIV infection | HIV-1 integrase strand transfer inhibitor |
| ZINC100054334 | -8.37 ± 0.11 | -8.17 ± 0.11 | -8.30 ± 0.2 | 0.629 | 0.448 | 0.633 | p-O-glucuronide rosiglitazone | Metabolite of rosiglitazone (Anti-diabetic) | PPAR receptors binder |
| ZINC00005116499 | -8.40 ± 0.47 | -8.70 ± 0.027 | -8.13 ± 0.64 | 0.627 | 0.446 | 0.632 | 4-hydroxymidazolam | Metabolite of midazolam (treatment of acute seizures) | Gamma-aminobutyric acid (GABA) inhibitor |
| ZINC000004744090 | -8.13 ± 0.51 | -8.03 ± 0.58 | -8.37 ± 0.35 | 0.692 | 0.512 | 0.697 | Methylprednisolone | Treatment of Leukemia | Steroid. Not available |
| DB08882 | -8.63 ± 0.38 | -8.80 ± 0.33 | -8.53 ± 0.51 | 0.742 | 0.563 | 0.747 | Linagliptin | Treatment of type II diabetes | DPP-4 inhibitor |
| ZINC00003882897 | -8.57 ± 0.44 | -8.97 ± 0.22 | -8.37 ± 0.62 | 0.699 | 0.522 | 0.704 | Pyronaridine | Treatment of Malaria | Not available |
| ZINC000043205655 | -8.63 ± 0.64 | -8.97 ± 0.49 | -8.33 ± 0.91 | 0.653 | 0.475 | 0.659 | Telotristat ethyl | Treatment of carcinoid syndrome diarrhea | Serotonin synthesis inhibitor |
| ZINC5843546 | -7.20 ± 0.27 | -7.57 ± 0.04 | -7.07 ± 0.29 | 0.735 | 0.559 | 0.741 | Azosemide | Hypertension | Not available. Potentially interact with RAAS |
| ZINC5104028 | -8.03 ± 0.38 | -8.03 ± 0.18 | -7.83 ± 0.31 | 0.653 | 0.478 | 0.657 | Ormeloxifene | Oral contraceptive, anti-cancer | Non-steroidal Selective Estrogen Receptor Modulator ^e |

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SSnet scores with and without Zinc of known RAAS interacting molecules

Table S4 shows the difference in SSnet scores for known RAAS interacting molecules in presence and absence of zinc. This table provides an indication of the positive influence of Zinc cation in the binding probabilities of these compounds, suggesting a positive cooperation of Zinc and these molecules in binding to the ACE2 receptor.

Table S4: SSnet scores with and without Zinc of known RAAS interacting molecules.

| | 6M1D-SSnet-Zn | 6M17-SSnet-Zn | 6M18-SSnet-Zn | 6M1D-SSNet | 6M17-SSNet | 6M18-SSNet | Common name | Function |
|------------------|---------------|---------------|---------------|------------|------------|------------|-------------|-----------------------|
| DB00722 | 0.855 | 0.715 | 0.857 | 0.804 | 0.662 | 0.809 | Lisinopril | ACE Inhibitor |
| DB01197 | 0.155 | 0.150 | 0.153 | 0.127 | 0.135 | 0.125 | Captopril | ACE Inhibitor |
| DB00542 | 0.208 | 0.185 | 0.205 | 0.167 | 0.162 | 0.165 | Benazepril | ACE Inhibitor |
| DB01340 | 0.693 | 0.532 | 0.692 | 0.627 | 0.503 | 0.629 | Cilazapril | ACE Inhibitor |
| DB09477 | 0.779 | 0.614 | 0.781 | 0.686 | 0.552 | 0.688 | Enalaprilat | ACE Inhibitor |
| ZINC00003801163 | 0.842 | 0.706 | 0.844 | 0.799 | 0.672 | 0.803 | Quinapril | ACE Inhibitor |
| ZINC000003875259 | 0.659 | 0.529 | 0.658 | 0.529 | 0.442 | 0.529 | Valsartan | ACE2 receptor blocker |
| DB00275 | 0.274 | 0.216 | 0.271 | 0.140 | 0.142 | 0.138 | Olmesartan | ACE2 receptor blocker |
| DB00876 | 0.286 | 0.253 | 0.282 | 0.147 | 0.159 | 0.142 | Eprosartan | ACE2 receptor blocker |
| DB00966 | 0.363 | 0.273 | 0.360 | 0.101 | 0.112 | 0.098 | Telmisartan | ACE2 receptor blocker |
| DB01029 | 0.902 | 0.800 | 0.903 | 0.870 | 0.763 | 0.874 | Irbesartan | ACE2 receptor blocker |
| ZINC000004074875 | 0.903 | 0.806 | 0.905 | 0.809 | 0.689 | 0.813 | Candesartan | ACE2 receptor blocker |

SSnet scores are probability, in the range from 0 to 1, of a drug binding with a IC50 less than 10nM. Smina values are provided in kcal/mol. Values represent mean of 3 replicas. The deviation reported is calculated using the average of absolute deviations from the mean values of the 3 smina replicas.

SSnet scores with and without Zinc on top SSnet scores

Table S5: Zinc effect on SSnet binding probabilities

| | 6M1D-SSnet-Zn | 6M17-SSnet-Zn | 6M18-SSnet-Zn | 6M1D-SSnet | 6M17-SSnet | 6M18-SSnet | Common name | Usage |
|------------------|---------------|---------------|---------------|------------|------------|------------|---------------------------|------------------------------|
| DB01180 | 0.761 | 0.637 | 0.759 | 0.462 | 0.371 | 0.459 | Rescinnamine | ACE Inhibitor |
| ZINC000261494566 | 0.791 | 0.712 | 0.789 | 0.508 | 0.416 | 0.504 | Rifabutin | Macrolide |
| DB01129 | 0.769 | 0.592 | 0.772 | 0.436 | 0.349 | 0.435 | Rabeprazole | Proton Pump inhibitor |
| ZINC000008577218 | 0.627 | 0.470 | 0.628 | 0.216 | 0.216 | 0.213 | Folic Acid | Vitamin B9 |
| DB01228 | 0.787 | 0.626 | 0.789 | 0.485 | 0.384 | 0.484 | Encainide | Sodium channel blocker |
| ZINC000021981290 | 0.695 | 0.513 | 0.696 | 0.327 | 0.274 | 0.326 | 5'-O-Desmethyl Omeprazole | Proton Pump inhibitor |
| DB03147 | 0.513 | 0.398 | 0.510 | 0.208 | 0.161 | 0.204 | FAD | Vitamin |
| DB05351 | 0.771 | 0.596 | 0.773 | 0.473 | 0.360 | 0.473 | Dexlansoprazole | Proton Pump inhibitor |
| DB00448 | 0.771 | 0.596 | 0.773 | 0.473 | 0.360 | 0.473 | Lansoprazole | Proton Pump inhibitor |
| DB12808 | 0.617 | 0.478 | 0.615 | 0.281 | 0.246 | 0.279 | Trifarotene | Retinoid Cream |
| DB00678 | 0.869 | 0.735 | 0.871 | 0.668 | 0.512 | 0.674 | Losartan | ACE2 receptor blocker |
| DB00605 | 0.748 | 0.570 | 0.750 | 0.453 | 0.352 | 0.453 | Sulindac | COX2 inhibitor |
| DB11641 | 0.608 | 0.494 | 0.605 | 0.362 | 0.286 | 0.357 | Vinflunine | Tubulin: Anti-tumour |
| DB01026 | 0.693 | 0.534 | 0.693 | 0.405 | 0.327 | 0.404 | Ketoconazole | Antifungal |
| DB06787 | 0.680 | 0.529 | 0.679 | 0.401 | 0.330 | 0.400 | Hexacyclium | Muscarinic: replace by PPI's |

SSnet scores are probability, in the range from 0 to 1, of a drug binding with a IC50 less than 10nM. Smina values are provided in kcal/mol. Values represent mean of 3 replicas. The deviation reported is calculated using the average of absolute deviations from the mean values of the 3 smina replicas.

Top Scores for SSnet ACE2 (open) - ACE2:S1 (closed) with Zinc.

Table S6 shows the top compounds ranked according SSnet score in presence of Zinc.

Table S6: Top Scores for SSnet ACE2 (open) - ACE2:S1 (closed) with Zinc.

| Drug name | ACE2 (open) | smina ACE2:S1 (closed) | ACE2 (closed) | ACE2 (open) | SSnet ACE2:S1 (closed) | ACE2 (closed) | Common name | Usage | Mode of Action |
|------------------|--------------|------------------------------|---------------|-------------|------------------------------|---------------|---------------------------------|--|--|
| DB13125 | -7.00 ±0.20 | -7.60 ±0.73 | -7.23 ±0.98 | 0.712 | 0.500 | 0.713 | Lusutrombopag | Treatment of thrombocytopenia | Thrombopoietin receptor (TPOR) agonist |
| ZINC000100054334 | -8.37 ±0.11 | -8.17 ±0.11 | -8.30 ±0.20 | 0.677 | 0.466 | 0.678 | P-O-Glucuronide Rosiglitazone | Metabolite of rosiglitazone | Not applicable |
| ZINC000095618628 | -8.33 ±0.24 | -8.47 ±0.22 | -8.27 ±0.36 | 0.668 | 0.458 | 0.668 | 3-Hydroxynevirapine Glucuronide | Nevirapine metabolite (HIV treatment) | Reverse transcriptase inhibitor |
| ZINC000013682481 | -7.87 ±0.24 | -8.00 ±0.13 | -7.73 ±0.31 | 0.641 | 0.432 | 0.641 | Elvitegravir | Treatment of HIV | Integrase inhibitor |
| DB08966 | -6.43 ±0.09 | -6.60 ±0.07 | -6.57 ±0.09 | 0.638 | 0.429 | 0.639 | Fursultiamine | Thiamine deficiency | Disulfide derivative of thiamine |
| ZINC000040165220 | -10.00 ±0.27 | -9.93 ±0.51 | -10.30 ±0.27 | 0.652 | 0.447 | 0.652 | Estriol-3-glucuronide | Human metabolite of 16α, 17β-estriol | Not applicable |
| ZINC000014089740 | -9.43 ±0.16 | -9.63 ±0.04 | -9.53 ±0.11 | 0.693 | 0.488 | 0.695 | Morphine-6-Glucuronide | Active metabolite of morphine | Opiod receptor binder |
| DB04570 | -8.33 ±0.16 | -8.47 ±0.04 | -8.37 ±0.04 | 0.662 | 0.460 | 0.664 | Latamoxef | Antibiotic (Second-Generation Cephalosporin) | Inhibition of cross-linking of the peptidoglycan |
| DB00683 | -7.93 ±0.58 | -8.13 ±0.44 | -7.73 ±0.71 | 0.704 | 0.502 | 0.705 | Midazolam | Sedative | Enhances inhibitory action of GABA |
| ZINC000002516030 | -8.06 ±0.11 | -8.13 ±0.04 | -8.00 ±0.13 | 0.724 | 0.524 | 0.724 | Hydroxy haloperidol | Schizophrenia | Not applicable |
| ZINC000008215517 | -7.30 ±0.33 | -7.57 ±0.18 | -7.17 ±0.42 | 0.691 | 0.491 | 0.693 | Cocarboxylase | Thiamine derivative | Biochemical catalysts |
| ZINC000004175630 | -9.17 ±0.09 | -9.50 ±0.27 | -9.37 ±0.36 | 0.692 | 0.492 | 0.691 | Orap | Antipsychotic agent | Possibly acting on postsynaptic dopamine receptors |

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Smina and SSnet scores for top scoring compounds according to smina without restriction on number of atoms

Table S7 shows the top scoring compounds ranked on the basis of smina score when no cutoff on the number of atoms is applied. It can be noted that the top binding compounds present a large deviation associated with their smina energies. The deviation reported is calculated using the average of absolute deviations from the mean values of the 3 smina replicas. A significant amount of the compounds in this table are macrolides with an antibiotic function.

Table S7: Smina and SSnet scores for top scoring compounds according to smina without restriction on number of atoms.

| Drug name | ACE2 (open) | smina ACE2:S1 (closed) | ACE2 (closed) | ACE2 (open) | SSnet ACE2:S1 (closed) | ACE2 (closed) | Common name | Class | Usage |
|------------------|-----------------|------------------------------|------------------|----------------|------------------------------|------------------|--|--|---|
| NuBBE_1255 | -13.43 +/- 0.56 | -14.30 +/- 0.80 | -13.57 +/- 1.29 | 0.025 | 0.029 | 0.024 | β -Pedunculagin | Hydrolysable Tannin | Anti-inflammatory, anticancer, antioxidant. |
| NuBBE_1179 | -13.53 +/- 0.24 | -13.90 +/- 0.00 | -13.57 +/- 0.22 | 0.016 | 0.019 | 0.016 | castalagin | Hydrolysable Tannin | Antioxidant, antitumorigenic |
| NuBBE_1178 | -13.43 +/- 0.24 | -13.83 +/- 0.71 | -13.57 +/- 0.89 | 0.020 | 0.024 | 0.020 | casuarinin | Hydrolysable Tannin | Antitrypanosomal, Antileishmanial |
| DB00615 | -12.43 +/- 1.76 | -13.20 +/- 2.00 | -13.30 +/- 1.93 | 0.928 | 0.884 | 0.929 | Rifabutin | Macrolactams | Broad-spectrum antibiotic |
| DB01201 | -11.87 +/- 1.84 | -13.30 +/- 1.53 | -12.93 +/- 2.09 | 0.980 | 0.966 | 0.981 | Rifapentine | Macrolactams | Anti tuberculosi |
| DB01045 | -11.70 +/- 1.27 | -12.90 +/- 1.80 | -12.67 +/- 1.96 | 0.971 | 0.950 | 0.971 | Rifampicin | Macrolactams | Broad-spectrum antibiotic |
| DB00644 | -12.80 +/- 0.3 | -12.10 +/- 1.20 | -11.97 +/- 1.11 | 0.925 | 0.853 | 0.928 | Gonadorelin | Gonadotropin-releasing hormone (peptide) | Ovulation induction therapy |
| SANC00526 | -11.70 +/- 0.93 | -12.23 +/- 0.49 | -12.57 +/- 0.16 | 0.000 | 0.001 | 0.000 | 1',2-Binaphthalen-4-one-2',3-dimethyl-1,8'-epoxy-1,4',5,5',8,8'-hexahydroxy-5',8-di-O- β -xylopyranosyl (1 \rightarrow 6)- β -glucopyranoside | Binaphthalenone | Antibacterial |
| NuBBE_1967 | -11.73 +/- 0.64 | -12.40 +/- 0.40 | -11.40 +/- 0.27 | 0.088 | 0.102 | 0.086 | Gnetin-E | Phenylpropanoids | None associated |
| NuBBE_200 | -11.63 +/- 0.96 | -12.27 +/- 0.49 | -11.17 +/- 1.22 | 0.054 | 0.064 | 0.053 | Amentoflavone | Flavonoids | Topical anti-inflammatory |
| ZINC000169621200 | -11.57 +/- 0.11 | -11.87 +/- 0.42 | -11.97 +/- 0.35 | 0.965 | 0.934 | 0.966 | Rifaximin | Macrolactams | Antibiotic (E. coli) |
| SANC00491 | -9.60 +/- 0.00 | -11.80 +/- 0.00 | -11.20 +/- 0.00 | 0.879 | 0.791 | 0.880 | Cephalostatin 17 | Bis-steroidal | Potential anti-leukemia treatment |
| DB00007 | -11.00 +/- 0.27 | -11.23 +/- 0.58 | -11.80 +/- 0.67 | 0.990 | 0.979 | 0.991 | Leuprolide | Synthetic peptide hormone | Prostate cancer, uterine fibroids, and endometriosis. |
| ZINC000164528615 | -10.83 +/- 0.44 | -11.13 +/- 0.78 | -11.77 +/- 0.36 | 0.998 | 0.995 | 0.998 | Glecaprevir | Antiviral | Hepatitis C |
| NuBBE_288 | -11.00 +/- 0.60 | -11.77 +/- 0.18 | -10.70 +/- 0.53 | 0.006 | 0.007 | 0.005 | Procyanidin B-3 1',2-Binaphthalen-4-one-2',3-dimethyl-1,8'-epoxy-1,4',5,5',8,8'-hexahydroxy-8-O- β -glucopyranosyl-5',8-O- β -xylopyranosyl (1 \rightarrow 6)- β -glucopyranoside | Binaphthalenone | Antioxidant |
| SANC00524 | -11.50 +/- 0.53 | -11.73 +/- 0.58 | -11.63 +/- 0.64 | 0.001 | 0.001 | 0.000 | Epimesquitol-(4 β \rightarrow 5)-3',4',7,8-pentahydroxyflavonone | Flavonoid | Antimicrobial |
| SANC00559 | -11.47 +/- 0.38 | -11.70 +/- 0.13 | -11.23 +/- 0.44 | 0.012 | 0.014 | 0.011 | Epimesquitol-(4 β \rightarrow 5)-3,3',4',7,8-pentahydroxyflavonone | Flavonoid | None associated |
| SANC00479 | -9.10 +/- 0.00 | -11.70 +/- 0.00 | -10.50 +/- 0.00 | 0.799 | 0.700 | 0.798 | Cephalostatin 3 | Alkaloid, steroid, cephalostatin | Anticancer |
| SANC00558 | -11.30 +/- 0.40 | -11.67 +/- 0.36 | -11.17 +/- 0.69 | 0.012 | 0.014 | 0.011 | Epimesquitol-(4 β \rightarrow 5)-3,3',4',7,8-pentahydroxyflavonone | Flavonoid, Promelacacinidin | None associated |
| DB00512 | -11.20 +/- 0.73 | -11.67 +/- 0.71 | -11.07 +/- 0.31 | 0.993 | 0.987 | 0.993 | Vancomycin | Glycopeptide related (Staphylococcus aureus) | Antibacterial |

SSnet scores are probability, in the range from 0 to 1, of a drug binding with a IC50 less than 10nM. Smina values are provided in kcal/mol. Values represent mean of 3 replicas. The deviation reported is calculated using the average of absolute deviations from the mean values of the 3 smina replicas.

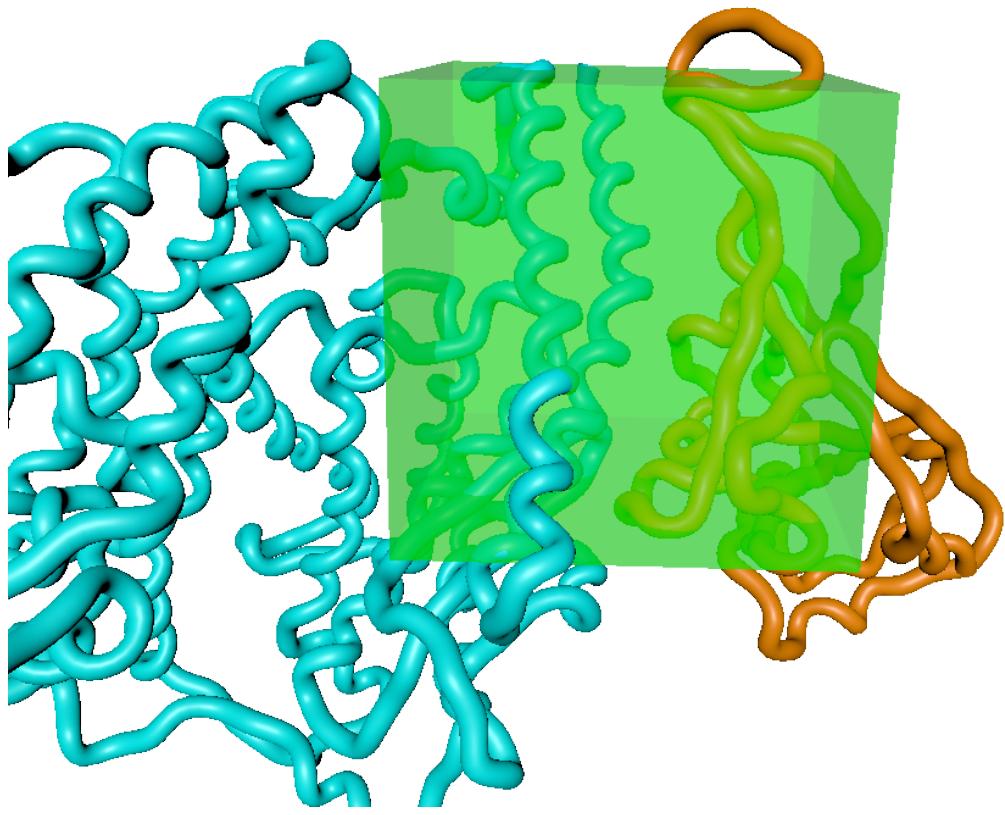


Figure S1: ACE2:S1 complex with box used for docking. In blue ACE2 receptor. In orange S1 sub-unit of the spike protein. In green box used for the smina docking.

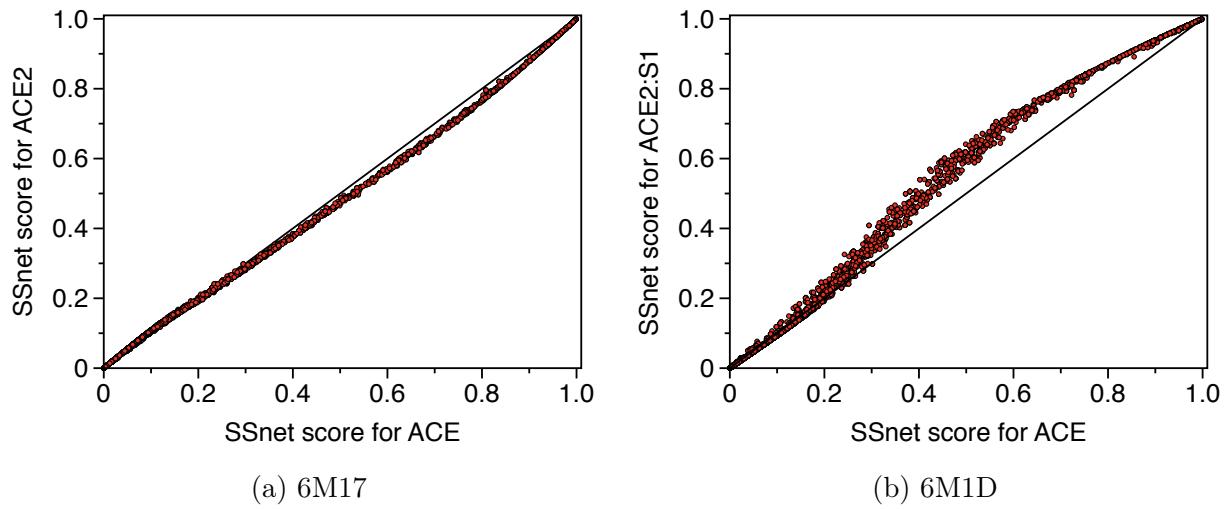


Figure S2: SSnet scores on ACE and ACE2

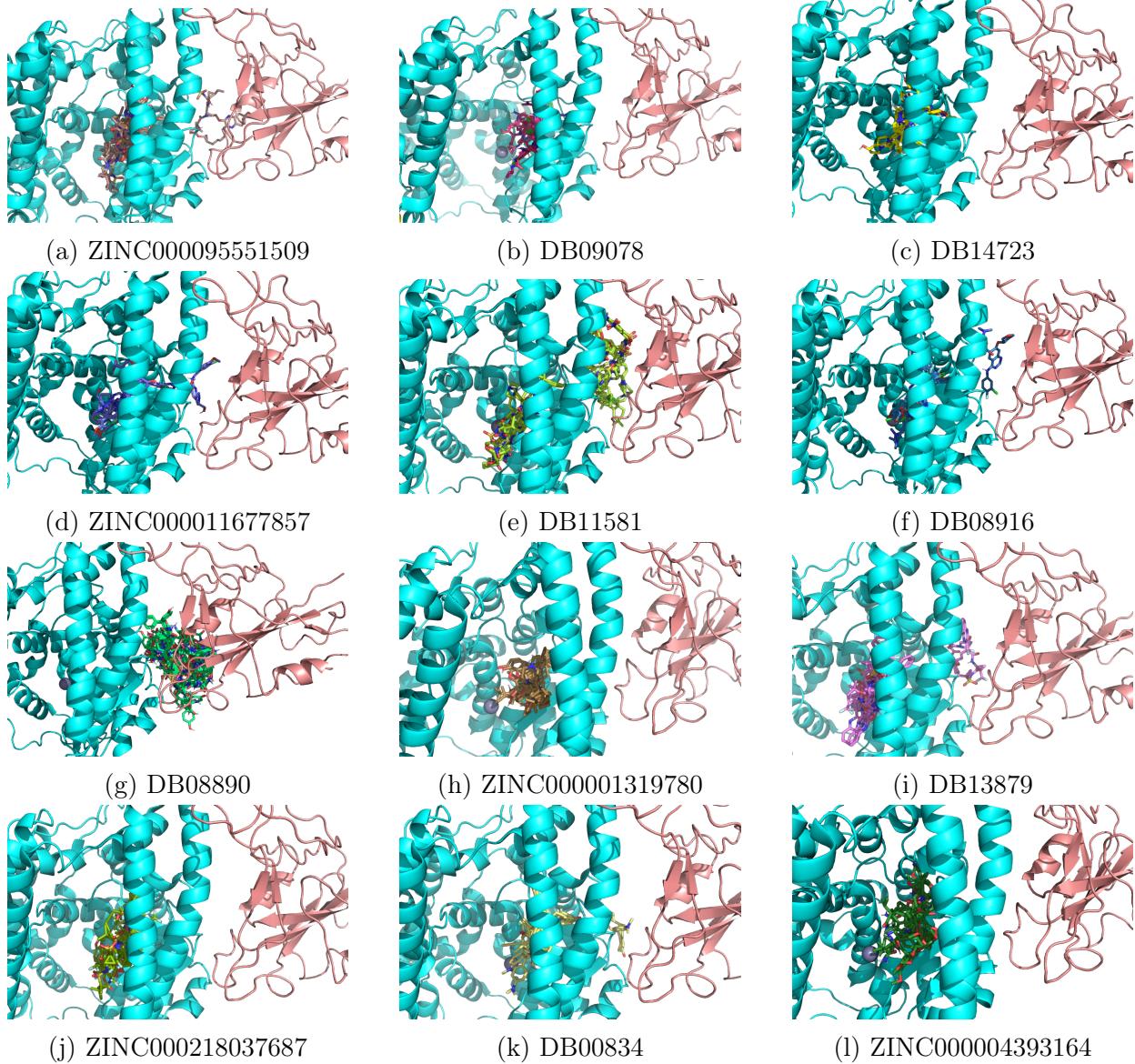


Figure S3: Binding poses for the compounds listed in Table S2

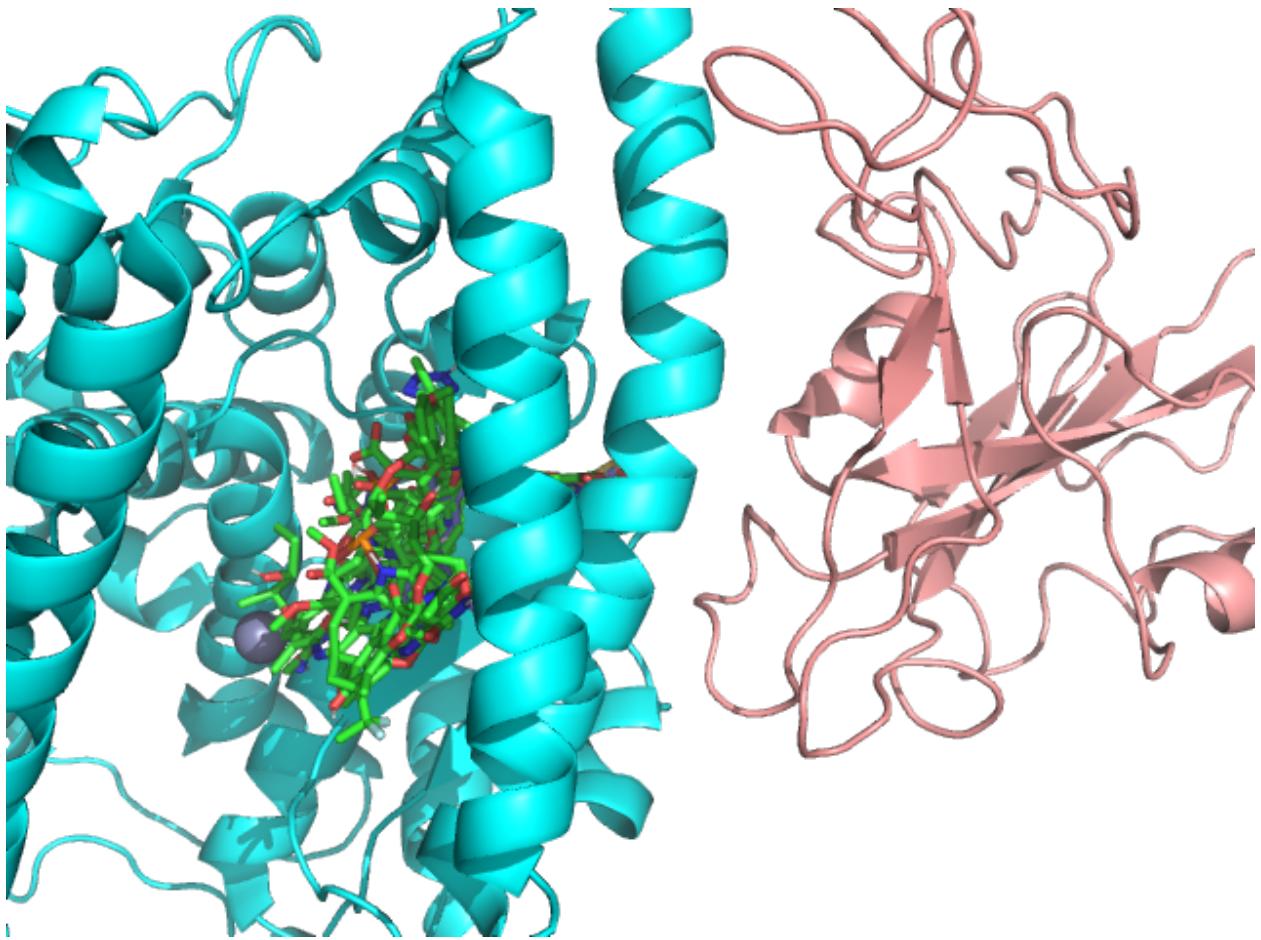


Figure S4: Top 15 ligands that are significantly affected by considering Zn in SSnet.

Defective 3D structures

The following list of DrugBank, ZINC, NuBBE and SANC IDs are the compounds with incorrect 3D structures when converting from SMILES.

| | | |
|------------------|------------------|------------------|
| DB14702 | ZINC000100054873 | ZINC000169987861 |
| DB11590 | ZINC000261494693 | ZINC000261494596 |
| ZINC000100003506 | ZINC000261527167 | ZINC000261494599 |
| ZINC000100003201 | ZINC000100053566 | ZINC000100054182 |
| ZINC000100003504 | ZINC000100353857 | ZINC000261494598 |
| ZINC000100005085 | DB00462 | ZINC000100054187 |
| ZINC000100036955 | ZINC000005497532 | ZINC000003915154 |
| ZINC000100036957 | ZINC000100053083 | ZINC000014261579 |
| ZINC000100003200 | ZINC000100053563 | ZINC000118913630 |
| ZINC000100052205 | ZINC000100068871 | ZINC000118915338 |
| ZINC000100002769 | ZINC000100353864 | ZINC000040164488 |
| ZINC000100022260 | DB00757 | ZINC000118915336 |
| ZINC000100002768 | ZINC000004215173 | ZINC000118915339 |
| ZINC000100022257 | ZINC000015449189 | ZINC000257459143 |
| ZINC000022053867 | ZINC000100036938 | ZINC000118915337 |
| ZINC000022053870 | ZINC000100053074 | ZINC000257526034 |
| DB05389 | ZINC000005167162 | DB00320 |
| ZINC000212549525 | ZINC000100054893 | ZINC000118915331 |
| ZINC000100037714 | ZINC000257384247 | ZINC000256315101 |
| ZINC000212549609 | ZINC000101144764 | ZINC000095617624 |
| ZINC000100037710 | ZINC000257384244 | ZINC000256315095 |
| ZINC000100053860 | ZINC000261494628 | ZINC000256315111 |
| ZINC000150307441 | ZINC000100054890 | ZINC000118913648 |

| | | |
|------------------|------------------|------------------|
| ZINC000100053849 | ZINC000242723020 | DB09297 |
| ZINC000100053855 | DB12161 | ZINC000256315106 |
| ZINC000009411213 | ZINC000100037885 | ZINC000118913649 |
| ZINC000100003677 | ZINC000100037890 | ZINC000169621209 |
| ZINC000100035525 | ZINC000261494622 | ZINC000169621210 |
| ZINC000100042145 | DB09015 | ZINC000256641128 |
| ZINC000100053845 | ZINC000100017742 | ZINC000256640979 |
| ZINC000100042076 | DB00995 | ZINC000085552271 |
| ZINC000100003676 | ZINC000012494340 | ZINC000100053092 |
| ZINC000002008391 | ZINC000256479159 | ZINC000299818014 |
| ZINC000100054361 | ZINC000005167145 | ZINC000118915215 |
| ZINC000100390602 | ZINC000100017736 | ZINC000085537011 |
| ZINC000000402954 | ZINC000003876023 | ZINC000095862733 |
| ZINC000002008394 | ZINC000004097304 | ZINC000299872475 |
| ZINC000100054365 | ZINC000095618838 | ZINC000096006012 |
| ZINC000012503137 | ZINC000095889730 | ZINC000299872477 |
| ZINC000100051396 | ZINC000103561250 | ZINC000299872478 |
| ZINC000104344008 | ZINC000261515676 | ZINC000299872476 |
| ZINC000100003507 | DB00860 | DB13995 |
| ZINC000100003509 | ZINC000008220548 | ZINC000261494615 |
| ZINC000100051395 | ZINC000169621213 | ZINC000255962815 |
| ZINC000100053185 | ZINC000169621217 | ZINC000245190610 |
| ZINC000100054812 | ZINC000251257402 | DB00115 |
| ZINC000009212324 | ZINC000253387331 | DB09385 |
| ZINC000100051302 | DB00957 | DB00200 |
| ZINC000100053305 | ZINC000106400715 | DB06402 |
| ZINC000169339296 | ZINC000169621214 | DB11191 |

| | | |
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| ZINC000005513515 | ZINC000082004496 | NuBBE_1669 |
| ZINC000100053191 | DB00253 | NuBBE_2010 |
| ZINC000100053295 | DB14583 | NuBBE_1551 |
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| ZINC000100054130 | ZINC000044963475 | NuBBE_1786 |
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| ZINC000221408371 | ZINC000005459685 | NuBBE_429 |
| ZINC000261494583 | ZINC000118913726 | NuBBE_1366 |
| ZINC000003831582 | ZINC000261494643 | NuBBE_2520 |
| ZINC000003871891 | ZINC000005459684 | NuBBE_2301 |
| ZINC000083294652 | ZINC000100054235 | NuBBE_1530 |
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| ZINC000100054124 | DB01234 | NuBBE_2149 |
| ZINC000100054840 | ZINC000008679996 | NuBBE_1935 |
| ZINC000256421827 | DB14540 | NuBBE_1705 |
| ZINC000261494582 | ZINC000004213353 | NuBBE_2148 |
| ZINC000261494603 | ZINC000261494664 | NuBBE_1228 |
| ZINC000003872494 | ZINC000004097440 | NuBBE_1548 |
| ZINC000100018598 | ZINC000084441937 | NuBBE_997 |
| ZINC000261494670 | ZINC000169621195 | NuBBE_2017 |
| DB00956 | ZINC000100013130 | NuBBE_1675 |
| ZINC000003872493 | ZINC000100036924 | NuBBE_1005 |
| ZINC000100051205 | ZINC000100038287 | NuBBE_2235 |
| ZINC000100054856 | ZINC000169621196 | NuBBE_2407 |
| ZINC000110344463 | DB00596 | NuBBE_1576 |
| ZINC000085552393 | ZINC000100038281 | NuBBE_1578 |
| ZINC000100018594 | ZINC000238730561 | NuBBE_2409 |

| | | |
|------------------|------------------|------------|
| ZINC000100054849 | DB14669 | NuBBE_1354 |
| ZINC000118912393 | ZINC000004097439 | NuBBE_1483 |
| ZINC000253497554 | ZINC000038611810 | NuBBE_440 |
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| ZINC000101210593 | ZINC000118915222 | NuBBE_72 |
| ZINC000256335053 | ZINC000100073786 | NuBBE_1033 |
| DB00977 | ZINC000100370145 | NuBBE_1163 |
| ZINC000100014791 | ZINC000111460375 | NuBBE_2193 |
| ZINC000100053366 | DB06777 | NuBBE_1035 |
| ZINC000100054079 | ZINC000095618776 | NuBBE_316 |
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| ZINC000100057533 | ZINC000003977777 | SANC00581 |
| ZINC000100054871 | ZINC000261494597 | SANC00140 |
| SANC00133 | SANC00551 | SANC00218 |
| SANC00518 | SANC00141 | SANC00552 |