

## CONSTRUCTION OF THREE DIMENSIONAL STRUCTURES OF PHYTOESTROGENS CONVERTED FROM SMILES STRING REPRESENTATIONS FOR SIMULATIONS USING PLANTS DOCKING SOFTWARE

### KONSTRUKSI STRUKTUR TIGA DIMENSI FITOESTROGEN HASIL KONVERSI DARI SMILES STRING REPRESENTATIONS UNTUK SIMULASI PENAMBATAN MOLEKULER MENGUNAKAN SOFTWARE PLANTS

Enade Perdana Istyastono<sup>1,\*</sup> and Nunung Yuniarti<sup>2</sup>

<sup>1</sup>Division of Drug Design and Discovery, Faculty of Pharmacy, Sanata Dharma University, Yogyakarta  
55282, Indonesia

<sup>2</sup>Department of Pharmacology and Clinical Pharmacy, Faculty of Pharmacy, Universitas Gadjah Mada,  
Sleman, Yogyakarta 55281, Indonesia

#### ABSTRACT

*Phytoestrogens have some important biological effects and could be employed as medicinal resources, for example as cancer chemopreventive agents. Phytoestrogen is defined as a phytochemical that has estrogenic or anti estrogenic effects. However, there is no database providing comprehensive list of phytoestrogen structures. In computer-aided drug discovery, the database is required to perform virtual screening for retrospective validation and structure-based drug design. The research presented in this article attempted to collect a comprehensive list of phytoestrogen structures. Subsequently, the structures were prepared in their three dimensional structures using SPORES1.3 for molecular docking simulations using PLANTS1.2. The ready-to-dock structures were then stored online as phytoestrogens.zip and could be downloaded from <http://molmod.org/phytoestrogens.zip>. This database contains 30 ready-to-dock unique phytoestrogens with total of 53 different configurations.*

**Keywords:** *Phytoestrogen, database, drug discovery, molecular docking*

#### ABSTRAK

*Fitoestrogen merupakan senyawa memiliki aktivitas biologis penting bahkan seringkali berpotensi sebagai agen kemoprevensi kanker. Fitoestrogen didefinisikan sebagai senyawa-senyawa alami dari tanaman yang memiliki efek estrogenik atau anti estrogenik. Meskipun demikian, sejauh ini belum ditemui basis data yang menyediakan struktur-struktur fitoestrogen secara komprehensif. Hal ini dapat menghambat penemuan obat berbantuan komputer ketika ketersediaan basis data sangat penting untuk melakukan penapisan virtual guna validasi retrospektif atau perancangan obat berbasis struktur. Penelitian yang disampaikan di artikel ini mencoba mengumpulkan struktur-struktur fitoestrogen secara komprehensif dan melakukan preparasi untuk membuat struktur-struktur tersebut dalam bentuk tiga dimensi dengan aplikasi SPORES1.3 dan siap menjadi berkas masukan untuk simulasi penambatan molekuler PLANTS1.2. Struktur-struktur siap ditambatkan tersebut kemudian disimpan dalam jaringan sebagai phytoestrogens.zip dan bisa diunduh di <http://molmod.org/phytoestrogens.zip>. Database ini memuat 30 struktur fitoestrogen dengan total 53 konfigurasi yang berbeda yang siap menjadi input simulasi penambatan molekuler.*

**Kata kunci:** *Fitoestrogen, basis data, penemuan obat, penambatan molekuler*

#### INTRODUCTION

Drugs discoveries have owed phytochemicals since they have become main resources for inspirations or even lead compounds in the early stages of the discovery and development

(Brusotti *et al.*, 2014; Efferth and Koch, 2011). Currently, drug discovery targeting breast cancer has become of timely and considerable interest since there is no recent breakthrough in the therapy (Cardoso and Senkus, 2015). Screening campaigns on phytochemicals to discover breast cancer chemopreventive agents have been performed, since it is believed to be able to serve

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**Corresponding Author : Enade Perdana Istyastono**  
**Email : [enade@usd.ac.id](mailto:enade@usd.ac.id)**

as starting points to discover novel breast cancer drugs (Balunas *et al.*, 2008; Helferich *et al.*, 2008; Istyastono, 2015; Setiawati *et al.*, 2014<sup>a</sup>; Shibata *et al.*, 2011; Vidhya and Devaraj, 2011). In the molecular level, one of the main targets to discover novel breast cancer chemopreventive agents is estrogen receptor  $\alpha$  (ER $\alpha$ ) (Ali and Coombes, 2000; Anita *et al.*, 2015, 2012; Istyastono, 2015; Radifar *et al.*, 2013; Setiawati *et al.*, 2014<sup>a</sup>; Shiau *et al.*, 1998).

Phytochemicals showed that estrogenic or anti estrogenic effects are, by definition, classed as phytoestrogens (Dixon, 2004; Helferich *et al.*, 2008). As ligands for estrogen receptors, these phytochemicals could show the estrogenic or anti estrogenic effects (Helferich *et al.*, 2008). Certain isoflavonoids, flavonoids, stilbenes, and lignans were identified as phytoestrogens (Dixon, 2004). Notably, the best studied phytoestrogen is the soy isoflavone genistein (Dixon, 2004; Helferich *et al.*, 2008; Varinska *et al.*, 2015). The interests on phytoestrogen have emerged not only related to their potency as breast cancer chemopreventive agents (Balunas *et al.*, 2008; Helferich *et al.*, 2008; Setiawati *et al.*, 2014<sup>a</sup>; Setiawati *et al.*, 2014<sup>b</sup>), but also their roles in osteoporosis, cognitive function, cardiovascular disease, immunity and inflammation, and reproduction (Dixon, 2004). However, although many phytochemicals were identified as phytoestrogens (Dixon, 2004; Helferich *et al.*, 2008), the comprehensive list of phytoestrogen is not available yet. The lack of this list hinders the attempts to thoroughly study how they bind to the receptors especially to ER $\alpha$  (Istyastono, 2015; Pathania *et al.*, 2015; Setiawati *et al.*, 2014<sup>a</sup>), which in turn could efficiently assist the discovery of novel ligands for the receptors (Istyastono *et al.*, 2015<sup>a</sup>; Istyastono *et al.*, 2015<sup>b</sup>; Kufareva *et al.*, 2014; Pathania *et al.*, 2015).

This article presents the attempts to collect the structures of known phytoestrogens. The collected structures were virtually prepared using previously published ligand preparation procedures (Istyastono and Setyaningsih, 2015) to be ready for molecular docking simulations. This involved the generations of their three-dimensional (3D) structures (Istyastono and Setyaningsih, 2015; Setiawati *et al.*, 2014<sup>a</sup>). The structures in their ready-to-dock formats were subsequently stored online as phytoestrogens.zip and could be obtained from <http://molmod.org/phytoestrogens.zip> for further usages. Additionally, this article presents also the molecular docking studies of genistein as the best studied phytoestrogen in the ER $\alpha$  binding pocket. The atomic interactions of the resulted pose to the ER $\alpha$  binding pocket were then compared to the

interactions of the pose of the co-crystal ligand 4-hydroxytamoxifen (4-OHT).

## METHODOLOGY

### Materials and Instrumentation

The phytochemicals mentioned in Dixon (2004) were used as the starting points. The ZINC and ChEMBL databases were the main references to obtain the phytoestrogen structure (Bento *et al.*, 2014; Irwin *et al.*, 2012). The crystal structure of ER $\alpha$  obtained from the protein data bank (PDB) with PDB id of 3ERT (Shiau *et al.*, 1998) was used as the reference structure for molecular docking simulations. Files **plants.config**, **protein.mol2**, and **water.mol2** to perform the simulations were obtained from Anita *et al.* (2012).

Computational medicinal chemistry applications employed in this research were SPORES version 1.3 or SPORES1.3 (ten Brink and Exner, 2009), PLANTS version 1.2 or PLANTS1.2 (Korb *et al.*, 2009; Korb *et al.*, 2007), Open Babel 2.2.3 (O'Boyle *et al.*, 2011), and PyMOL 1.2r1 (Lill and Danielson, 2011). All computations were performed in a Virtual Private Server (VPS) with internet protocol (IP) address of 103.247.10.66. The server has Ubuntu 12.04.3 LTS as the operating system, Intel<sup>(R)</sup> Xeon<sup>(R)</sup> E5630 Quad Core @ 2.53GHz as the processor and 1 GB of RAM.

### Computational Details

The SMILES format of all compounds with estrogenic or anti estrogenic activity mentioned in Dixon (2004) were obtained from either ZINC database (Irwin *et al.*, 2012) or ChEMBL database (Bento *et al.*, 2014). Each compound was then subjected to Open Babel 2.2.3 conversion software to be converted in its three dimensional (3D) format as a **mol2** file. The **reprot** module in SPORES1.3 was subsequently employed to properly check and assign the **mol2** file into a proper **mol2** file with standard protonated state (ten Brink and Exner, 2009). This **mol2** file was ready to be docked by using PLANTS1.2 docking software. The ready-to-dock **mol2** files were compressed to a **zip** file and the **zip** file was subsequently uploaded to <http://molmod.org/>.

The file was subsequently downloaded to the VPS and unzipped. The **mol2** structures were then docked into ER $\alpha$  binding pocket employing PLANTS1.2 molecular docking software by following the previously published procedures by Anita *et al.* (2012) to examine if the structures were the ready-to-dock ones. The docking results were compressed to a **zip** file and the **zip** file was also uploaded to <http://molmod.org/>.

Table I. Name and structures (in SMILES format) of isoflavonoid phytoestrogens mentioned by Dixon (2004).

ZINC No. <sup>a)</sup>	Structure in SMILES format <sup>a)</sup>	Name <sup>b)</sup>
18847037	<chem>COc1ccc(cc1)c2coc3cc(cc3c2=O)O</chem>	biochanin A
1219	<chem>c1cc2c(cc1O)oc3c2c(=O)oc4c3ccc(c4)O</chem>	coumestrol
18847034	<chem>c1cc(ccc1c2coc3cc(ccc3c2=O)O)O</chem>	daidzein
4098610	<chem>c1cc(ccc1c2coc3cc(ccc3c2=O)O)[C@H]4[C@@H]([C@H]([C@@H]([C@H](O4)CO)O)O)O)O</chem>	daidzin <sup>c)</sup>
388660	<chem>c1cc(ccc1[C@H]2Cc3ccc(cc3OC2)O)O</chem>	equol
388661	<chem>c1cc(ccc1[C@@H]2Cc3ccc(cc3OC2)O)O</chem>	equol
18847036	<chem>COc1ccc(cc1)c2coc3cc(ccc3c2=O)O</chem>	formononetin
18825330	<chem>c1cc(ccc1c2coc3cc(cc3c2=O)O)O</chem>	genistein
4097913	<chem>c1cc(ccc1c2coc3cc(cc3c2=O)O)O[C@H]4[C@@H]([C@H]([C@@H]([C@H](O4)CO)O)O)O)O</chem>	genistin <sup>c)</sup>
33831433	<chem>CC1(C=Cc2c(ccc(c2O)C3=Cc4ccc(cc4OC3)O)O1)C</chem>	glabrene
5963549	<chem>CC1(C=Cc2c(ccc(c2O1)C3=Cc4ccc(cc4OC3)O)O)C</chem>	glabrene
4098719	<chem>CC1(C=Cc2c(ccc3c2OC[C@H](C3)c4ccc(cc4O)O)O1)C</chem>	glabridin
899797	<chem>CC1(C=Cc2c(ccc3c2OC[C@@H](C3)c4ccc(cc4O)O)O1)C</chem>	glabridin
5999205	<chem>COc1cc2c(cc1O)occ(c2=O)c3ccc(cc3)O</chem>	glycitein
3872928	<chem>CC(C)Oc1ccc2c(=O)cc(oc2c1)c3ccccc3</chem>	ipriflavone
4016	<chem>CC(C)Oc1ccc2c(c1)occ(c2=O)c3ccccc3</chem>	ipriflavone
14727569	<chem>CC(=CCc1c(ccc(c1O)[C@@H]2Cc3c(cc(c3OC)CC=C(C)C)O)OC2)O)C</chem>	licoricidin
5854565	<chem>CC(=CCc1c(ccc(c1O)[C@H]2Cc3c(cc(c3OC)CC=C(C)C)O)OC2)O)C</chem>	licoricidin
59729510	<chem>CC(C)/C=C/c1c(ccc(c1O)[C@@H]2Cc3c(cc(c3OC)CC=C(C)C)OC)OC2)O</chem>	licoricidin
59729511	<chem>CC(C)/C=C/c1c(ccc(c1O)[C@H]2Cc3c(cc(c3OC)CC=C(C)C)OC)OC2)O</chem>	licoricidin
985403	<chem>c1cc(ccc1[C@@H]2CC(=O)c3ccc(cc3O2)O)O</chem>	liquiritigenin
156701	<chem>c1cc(ccc1[C@@H]2CC(=O)c3c(cc(cc3O2)O)O)O</chem>	naringenin
1785	<chem>c1cc(ccc1[C@H]2CC(=O)c3c(cc(cc3O2)O)O)O</chem>	naringenin
4098745	<chem>c1cc(ccc1c2coc3c(c2=O)ccc(c3[C@H]4[C@@H]([C@H]([C@@H]([C@H](O4)CO)O)O)O)O)O</chem>	puerarin <sup>c)</sup>

<sup>a)</sup>One compound with more than one possible 3D configuration could have more than one structure in SMILES format (Bento *et al.*, 2014; Irwin *et al.*, 2012); <sup>b)</sup>As mentioned by Dixon (2004); <sup>c)</sup>For glycosides, only one configuration is included in the list since they have more than 5 different 3D configurations.

Visual inspections of the best pose of genistein resulted from the molecular docking simulations using PyMOL (Lill and Danielson, 2011) was then performed to analyze the plausible molecular determinants of ER $\alpha$ -phytoestrogen binding.

## RESULTS AND DISCUSSION

According to Dixon (2004), phytoestrogens were classified into isoflavonoid (Table I), flavonoid (Table II) and lignan (Table III) phytoestrogens. Beside those three main classes, there were other phytoestrogens, including chalcone and anthraquinone phytoestrogens (Table IV). Notably, there are still some other phytochemicals which have estrogenic or anti estrogenic effects but not listed in those tables (Tables I-IV), for example eugenol, alizarin,  $\alpha$ -mangostin (Matsuda *et al.*, 2001; Shibata *et al.*, 2011). Nevertheless, to construct a comprehensive

phytoestrogen structure database requires starting points (Pathania *et al.*, 2015) and the review on phytoestrogens by Dixon (2004) could serve as the starting points since it has covered most phytoestrogen classes and discussed the potent ones (Dixon, 2004; Helferich *et al.*, 2008; Mysinger *et al.*, 2012).

In total, there were 30 unique phytoestrogens presented in Tables I-IV. Since one compound could have more than one 3D configuration, there were 53 structural configurations indicated by the SMILES formats in Tables I-IV. ChEMBL database (Bento *et al.*, 2014) was subsequently inspected to append the information with the biological activities of the listed phytoestrogens at ER $\alpha$ . The results are presented in Table V. Only 9 phytoestrogens with biological activities at ER $\alpha$  are listed (Table V and Figure 1).

Table II. Name and structures (in SMILES format) of flavonoid phytoestrogens mentioned by Dixon (2004).

ZINC No. <sup>a)</sup>	Structure in SMILES format <sup>a)</sup>	Name <sup>b)</sup>
3873159	<chem>CC(=CCc1c(c(c2c(c1O)C(=O)C[C@H](O2)c3ccc(cc3O)CC=C(C)C)O)C</chem>	6,8-diprenylnaringenin
4098363	<chem>CC(=CCc1c(cc2c(c1O)C(=O)C[C@H](O2)c3ccc(cc3O)O)C</chem>	6-prenylnaringenin
5854068	<chem>CC(=CCC/C(=C/Cc1c(cc(c2c1O[C@@H](CC2=O)c3ccc(cc3O)O)O)/C)C</chem>	8-geranylnaringenin
39451	<chem>CC(=CCc1c(cc(c2c1O[C@H](CC2=O)c3ccc(cc3O)O)O)O)C</chem>	8-prenylnaringenin
39452	<chem>CC(=CCc1c(cc(c2c1O[C@@H](CC2=O)c3ccc(cc3O)O)O)O)C</chem>	8-prenylnaringenin
12353732	<chem>c1cc(ccc1/C=C\C2cc(cc(c2O)O)O</chem>	resveratrol <sup>c)</sup>
6787	<chem>c1cc(ccc1/C=C/c2cc(cc(c2O)O)O</chem>	resveratrol <sup>c)</sup>
2008845	<chem>CC(=CC[C@H](Cc1c(cc(c2c1O[C@H](CC2=O)c3ccc(cc3O)O)O)O)C(=C)C)C</chem>	sophoraflavanone_G
2008847	<chem>CC(=CC[C@H](Cc1c(cc(c2c1O[C@H](CC2=O)c3ccc(cc3O)O)O)O)C(=C)C)C</chem>	sophoraflavanone_G
2008848	<chem>CC(=CC[C@H](Cc1c(cc(c2c1O[C@@H](CC2=O)c3ccc(cc3O)O)O)O)C(=C)C)C</chem>	sophoraflavanone_G
2008850	<chem>CC(=CC[C@H](Cc1c(cc(c2c1O[C@@H](CC2=O)c3ccc(cc3O)O)O)O)C(=C)C)C</chem>	sophoraflavanone_G

<sup>a)</sup>One compound with more than one possible 3D configuration could have more than one structure in SMILES format (Bento *et al.*, 2014; Irwin *et al.*, 2012); <sup>b)</sup>As mentioned by Dixon (2004); <sup>c)</sup>Resveratrol was classified here since the biosynthesis was related to flavonoids (Dixon, 2004).

Table III. Name and structures (in SMILES format) of lignan phytoestrogens mentioned by Dixon (2004).

ZINC No. <sup>a)</sup>	Structure in SMILES format <sup>a)</sup>	Name <sup>b)</sup>
1360	<chem>c1cc(cc(c1O)C[C@H]2COC(=O)[C@H]2Cc3cccc(c3)O</chem>	enterolactone
388657	<chem>c1cc(cc(c1O)C[C@H]2COC(=O)[C@H]2Cc3cccc(c3)O</chem>	enterolactone
388658	<chem>c1cc(cc(c1O)C[C@H]2COC(=O)[C@H]2Cc3cccc(c3)O</chem>	enterolactone
388659	<chem>c1cc(cc(c1O)C[C@H]2COC(=O)[C@@H]2Cc3cccc(c3)O</chem>	enterolactone
4098820	<chem>COc1cc(ccc1O)C[C@H]2CO[C@H]([C@H]2CO)c3ccc(c(c3)OC)O</chem>	lariciresinol
1595956	<chem>COc1cc(ccc1O)C[C@H]2COC(=O)[C@H]2Cc3ccc(c(c3)OC)O</chem>	matairesinol
1595957	<chem>COc1cc(ccc1O)C[C@H]2COC(=O)[C@@H]2Cc3ccc(c(c3)OC)O</chem>	matairesinol
1595958	<chem>COc1cc(ccc1O)C[C@H]2COC(=O)[C@H]2Cc3ccc(c(c3)OC)O</chem>	matairesinol
900187	<chem>COc1cc(ccc1O)C[C@H]2COC(=O)[C@H]2Cc3ccc(c(c3)OC)O</chem>	matairesinol
4098921	<chem>COc1cc(ccc1O)[C@@H]2[C@H]3CO[C@H]([C@H]3CO2)c4ccc(c(c4)OC)O</chem>	pinoresinol
2020114	<chem>COc1cc(ccc1O)C[C@@H](CO)[C@@H](Cc2ccc(c(c2)OC)O)CO</chem>	secoisolariciresinol
14435411	<chem>COc1cc(cc(c1O)OC)[C@@H]2[C@@H]3CO[C@H]([C@H]3CO2)c4cc(c(c(c4)OC)O)OC</chem>	syringaresinol
18283077	<chem>COc1cc(cc(c1O)OC)[C@@H]2[C@@H]3CO[C@@H]([C@H]3CO2)c4cc(c(c(c4)OC)O)OC</chem>	syringaresinol
5998957	<chem>COc1cc(cc(c1O)OC)[C@@H]2[C@@H]3CO[C@@H]([C@@H]3CO2)c4cc(c(c(c4)OC)O)OC</chem>	syringaresinol
5998959	<chem>COc1cc(cc(c1O)OC)[C@@H]2[C@@H]3CO[C@H]([C@@H]3CO2)c4cc(c(c(c4)OC)O)OC</chem>	syringaresinol

<sup>a)</sup>One compound with more than one possible 3D configuration could have more than one structure in SMILES format (Bento *et al.*, 2014; Irwin *et al.*, 2012); <sup>b)</sup>As mentioned by Dixon (2004).

Table IV. Name and structures (in SMILES format) of other classes (chalcone and anthraquinone) phytoestrogens mentioned by Dixon (2004).

ZINC No. <sup>a)</sup>	Structure in SMILES format <sup>a)</sup>	Name <sup>b)</sup>
3860201	<chem>c1cc2c(cc1O)C(=O)c3ccc(cc3C2=O)O</chem>	2,6-dihydroxyanthraquinone
3824868	<chem>Cc1cc2c(c(c1O)C(=O)c3c(cc(cc3O)O)C2=O</chem>	emodin
3869608	<chem>c1cc(ccc1/C=C/C(=O)c2ccc(cc2O)O)O</chem>	isoliquiritigenin

<sup>a)</sup>One compound with more than one possible 3D configuration could have more than one structure in SMILES format (Bento *et al.*, 2014; Irwin *et al.*, 2012); <sup>b)</sup>As mentioned by Dixon (2004).

Table V. Biological activities (IC<sub>50</sub>) at ER $\alpha$  of some listed phytoestrogens (Bento *et al.*, 2014).

Name	ChEMBL <sup>a)</sup>		IC <sub>50</sub> (nM) <sup>b)</sup>
	Compound Identity	Assay Identity	
Coumestrol	CHEMBL30707	CHEMBL827788	76
Daidzein	CHEMBL8145	CHEMBL1219560	450
Genistein	CHEMBL44	CHEMBL891640	395
Ipriflavone	CHEMBL165790	CHEMBL1909145	Not active
Naringenin	CHEMBL9352	CHEMBL909843	75,302
8-prenylnaringenin	CHEMBL460647	CHEMBL909843	57
Resveratrol	CHEMBL165	CHEMBL1909145	Not active
2,6-Dihydroxyanthraquinone	CHEMBL298398	CHEMBL679893	1100
Emodin	CHEMBL289277	CHEMBL679893	2700

<sup>a)</sup>Ref: (Bento *et al.*, 2014); <sup>b)</sup>If there were more than one biological activities listed in the database, the most recent one was selected.

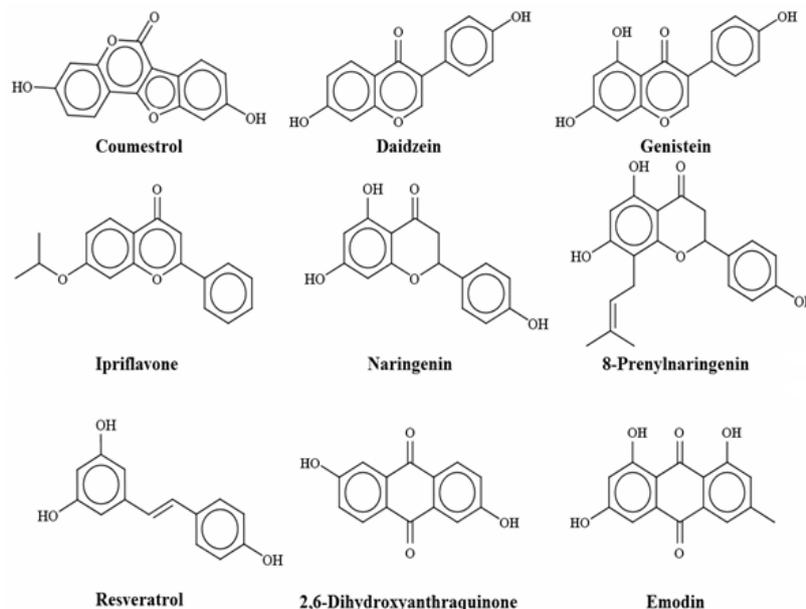


Figure 1. Structures (in two-dimensional format converted from the SMILES format) of some phytoestrogens (Table V).

Remarkably, all listed active phytoestrogens shared similar pharmacophore, *i.e.* they had hydroxyl phenolic and carbonyl moieties separated by 5 heavy atoms (Table V and Figure 1).

For the purpose of creating the database of the ready-to-dock phytoestrogens, an **smi** file named **phytoestrogens.smi** containing all listed structures in Tables I-IV was created. The structure of the file is as follows:

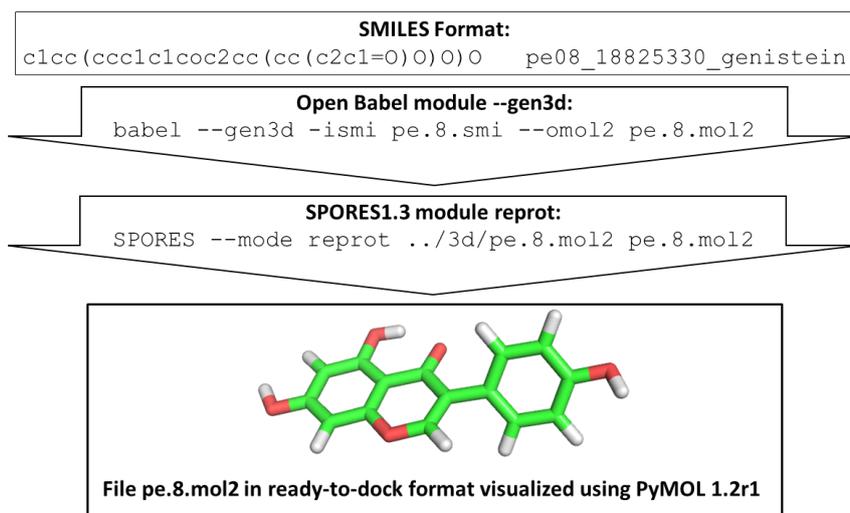


Figure 2. Flowchart of the ligand preparation process suggested in this article with genistein as the representative.

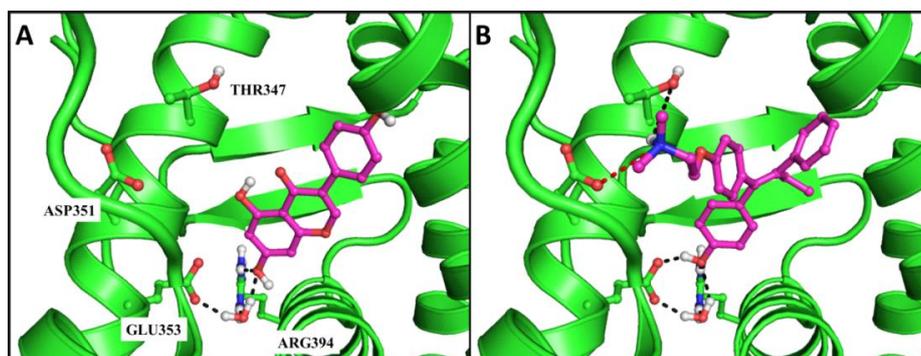


Figure 3. Binding poses genistein (A) and the co-crystal ligand 4-hydroxy tamoxifen (B) in the ER $\alpha$  binding pocket (Anita *et al.*, 2012; Shiau *et al.*, 1998). The ER $\alpha$  is presented in the cartoon mode with carbon atoms are in green, while the ligands are presented in the sticks mode with carbon atoms are in magenta. Only polar hydrogens (presented in white), residues (presented in sticks mode, carbon atoms are in green) with hydrogen bond interaction (presented in black dashes) and ionic interaction (presented in red dashes) to the ligand and a conserved water molecule (Anita *et al.*, 2012) are presented for the sake of clarity. Nitrogen and oxygen atoms are presented in blue and red, respectively. These figures adopted the similar figures published by Setiawati *et al.* (2014)

[SMILES] molmodID\_zincID\_name. For example, biochanin A (Table I) was written in the first line of **phytoestrogens.smi** as follows: COc1ccc(cc1)c2coc3cc(cc(c3c2=O)O)O pe01\_18847037\_biochaninA. Following the procedures aforementioned resulted in a **zip** file with size of 70 kilobytes. This file has been uploaded and attached to <http://molmod.org/> and could therefore be obtained from <http://molmod.org/phytoestrogens.zip>. In order to check the readiness of the uploaded ready-to-dock **mol2** file, further molecular docking

simulations employing previously published procedure by Anita *et al.* (2012) were performed. The docking simulations ran without giving any error messages. This confirmed that the uploaded input files were the ready-to-dock structures. For further analysis by public, the docking results were zipped in a **zip** file with size of 12 megabytes and the **zip** file was uploaded to <http://molmod.org/> and can be obtained from <http://molmod.org/phytoestrogens.PLANTS.zip>.

The best studied phytoestrogen genistein (Dixon, 2004; Helferich *et al.*, 2008; Varinska *et al.*,

2015) was selected as the representative for visual inspections. The process of transforming genistein from its SMILES format to the ready-to-dock 3D format is depicted in Figure 2. The best docking pose of genistein in the ER $\alpha$  binding pocket is presented in Figure 3.

Based on Figures 2 and 3, it could be concluded that the resulted **mol2** files were ready to be docked using PLANTS1.2. Moreover, by examining the binding poses of genistein and 4-OHT in the ER $\alpha$  binding pocket (Figure 3), the important binding interactions could be identified: the hydrogen bond network between genistein, GLU353, ARG394, and the conserved water molecule (Anita *et al.*, 2012; Shiau *et al.*, 1998). This is in line with the identified pharmacophore by examining Figure 1. Notably, the aromatic moieties of genistein align very similarly to the aromatic moieties of 4-OHT when they bind to ER $\alpha$ . Thus GLU353, ARG394, and the aromatic residue around genistein in the ER $\alpha$  binding pocket are highly suggested as the molecular determinants of ER $\alpha$ -ligand binding. The most plausible aromatic residue as the molecular determinant in the ER $\alpha$  binding pocket is TRP383 (Istyastono, 2015).

## CONCLUSION

The database of ready-to-dock 3D structures of phytoestrogens resulted in this research could be employed further to study the atomic level of their estrogenic or anti estrogenic activities. Genistein as the representative phytoestrogen employed further in molecular docking simulations into ER $\alpha$  has unraveled some the molecular determinants in the ER $\alpha$ -ligand binding: GLU353, TRP383 and ARG394.

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