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# Thymol and carvacrol derivatives as anticancer agents; synthesis, *in vitro* activity, and computational analysis of biological targets†

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Various thymol and carvacrol derivatives have been synthesized to test the anticancer activity potential. Computational methods including network pharmacology and molecular docking approaches were utilized to identify and assess the potential biological targets relating to cancer. Amongst the synthesized derivatives the ethoxy-cyclohexyl analogues were consistently the most active against a panel of 10 different cancer cell lines covering a variety of origins. Biological target predictions revealed the AKT1 protein to be a core and central target of the most active compounds. Molecular docking identified a binding pocket within this protein in which the most active compounds bind. The incorporation of computational analysis methods and conventional structure–activity approaches identified analogues of thymol and carvacrol with the highest anticancer potential, and analyzed their possible biological targets in a comprehensive manner.

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## 1. Introduction

Thymol is a monoterpene phenol appendant in *Thymus* species including *T. vulgaris* as well as *Trachyspermum ammi* fruits.<sup>1,2</sup> Carvacrol is structural isomer to thymol naturally occurring in *T. vulgaris* and *Origanum* species.<sup>3</sup> Both compounds are simple in structure with one reactive site that make derivatization generally straightforward, and hence, many derivatives were reported.<sup>4</sup> Many essential oils contain thymol, which exhibits many biological activities including antimicrobial,<sup>5</sup> anti-inflammatory,<sup>6</sup> wound healing,<sup>7</sup> antioxidant,<sup>8</sup> and due to its minimal toxicity, it shows promise as a botanical pesticide.<sup>9</sup> Thymol and thymol derivatives were reported to exert anticancer activity *via* various mechanisms including producing intracellular reactive oxygen species, suppressing cell growth, depolarizing mitochondrial membrane potential, inducing apoptosis, and activating the proapoptotic mitochondrial proteins Bax, interaction with cysteine aspartases (caspases) or poly ADP ribose polymerase.<sup>10–12</sup> Carvacrol possess antimicrobial, antioxidant, analgesic, antispasmodic, and anti-inflammatory activities amongst others.<sup>13–15</sup> Carvacrol has also

been reported to possess anticancer activity *via* decreasing the expressions of matrix metalloprotease 2 and 9.<sup>16,17</sup> Furthermore, carvacrol-derived Schiff base derivatives were reported to have anti-lung cancer activity as well.<sup>18</sup> These promising reports incentivize the pursuit of more active thymol and carvacrol derivatives. In this study, we synthesized various analogues and assessed the *in vitro* anticancer activity of these analogues in addition to the parent compounds. Furthermore, computational network pharmacology approaches were utilized to predict and analyze the possible cancer-related gene targets of these molecules.<sup>19</sup> In addition, the most integral biological gene target of the analogues with the highest anticancer activity was studied using molecular docking techniques to further elucidate the observed anticancer activity.

## 2. Materials and methods

### 2.1 General procedure for organic synthesis and analysis

Solvents and reagents were used as is without further treatment. Reactions were conducted under nitrogen gas. Thymol and carvacrol were acquired from Aktin Chemicals, Inc. (Chengdu, China). All solvents and remaining reagents were acquired from Sigma Aldrich (St. Louis, Missouri, United States of America). 1500-Micron preparative thin layer chromatography plates were acquired from ANALTECH (Newark, Delaware, United States of America). Nuclear magnetic resonance analysis was performed using CDCl<sub>3</sub> (chloroform-d<sub>3</sub>) on a Bruker Ultrashield Plus 500 MHz spectrometer at 24 °C. Chemical shifts (δ) are relative to TMS as ppm. Chemical shifts multiplicity are reported as “s” for singlet, “d” for doublet, “t” for triplet, and “m” for multiplet,

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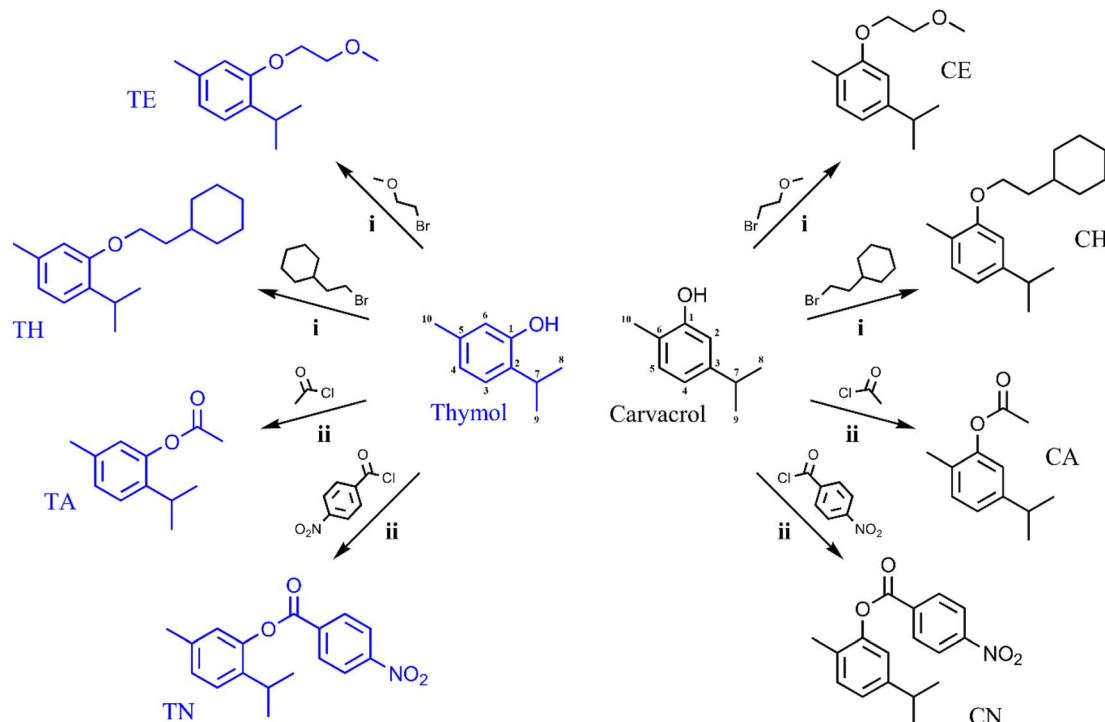


Fig. 1 Synthesis scheme and carbon numbering assignment of target compounds. Conditions: (i) potassium hydroxide, acetonitrile, 90 °C, 1 hour. (ii) triethylamine, tetrahydrofuran, 25 °C.

and broad shifts are preceded by “b”. Chloroform was used as a solvent to dilute samples in order to obtain 1 ppm concentration. Injection of 1  $\mu\text{L}$  of the solutions to Agilent GC/MS instrument Model 7890 MSD were performed with the help of autosampler adjusted to splitless mode. Helium (99.999% purity) was the carrier gas adjusted to flow rate = 1.2  $\text{mL min}^{-1}$ . HP5MS 30 m length column with 0.25 mm i.d. and 0.25  $\mu\text{m}$  thickness was used in the analysis. The injector temperature was set at a constant temperature of 280 °C. The instrument was programmed with a start temperature of 70 °C for 5 min, then gradual raising of the temperature at a rate of 2 °C  $\text{min}^{-1}$  till 120 °C where it was held for 2 min, followed by increasing rate of 15 °C  $\text{min}^{-1}$  to 290 °C that was kept for 2 min. The ionization in the mass spectrometer was performed at 70 eV, mass range was set between 30–600 daltons. The ion-source temperature was adjusted to 280 °C. High performance liquid chromatography (HPLC) analysis was used for compounds TN and CN due fragmentation when using GC. HPLC was carried out using a 250  $\times$  4.6 mm C18 column, a UV detector (254 nm), and a mobile phase consisting of 75 : 25 methanol and water (0.1% formic acid). HPLC samples were injected at a volume of 5  $\mu\text{L}$  at a concentration of 1  $\text{mg mL}^{-1}$ . The synthesis scheme and brief reaction conditions are depicted in Fig. 1. All analysis spectra are listed in the ESI.†

## 2.2 Preparation of 2-isopropyl-1-(2-methoxy-ethoxy)-5-methylbenzene (TE)

This compound was formed by reacting 0.33 mmole (50 mg) of thymol with 0.66 mmole (37 mg) of potassium hydroxide, and 1

mmole (94  $\mu\text{L}$ ) of 2-bromoethyl methyl ether in acetonitrile for 1 hour at 90 °C. Following this, water and a mixture of *n*-hexane and ethyl acetate (1 : 1 v/v) were added and the organic phase was collected, dried over anhydrous sodium sulphate, and condensed before purification using preparative TLC and a mobile phase consisting of *n*-hexane and ethyl acetate (2 : 1 v/v,  $R_f$  = 0.72). The product was collected as a colorless oil (17 mg, 0.082 mmole, 24.85%).

MS calculated: 208.146, found: 208.2.

GC AUC: >99%.

$^1\text{H}$  NMR (500 MHz,  $\text{CDCl}_3$ )  $\delta$  7.13 (1H, d,  $J$  = 7.2 Hz, H-3), 6.79 (1H, bd,  $J$  = 6.3 Hz, H-4), 6.71 (1H, bs, H-6), 4.15 (2H, s, H-1'), 3.81 (2H, s, H-2'), 3.50 (3H, s, H-3'), 3.35 (1H, m, H-7), 2.35 (3H, s, H-10), 1.39 (6H, d,  $J$  = 6.7 Hz, H-8, H-9).

$^{13}\text{C}$  NMR (125 MHz,  $\text{CDCl}_3$ )  $\delta$  21.36 (C-7), 22.82 (C-8, C-9), 26.54 (C-10), 59.25 (C-3'), 67.65 (C-2'), 71.32 (C-1'), 112.68 (C-6), 121.50 (C-4), 125.93 (C-3), 134.38 (C-2), 136.28 (C-5), 149.54 (C-1).

## 2.3 Preparation of 3-isopropyl-1-(2-methoxy-ethoxy)-6-methylbenzene (CE)

The reaction was carried out by reacting 0.33 mmole (52  $\mu\text{L}$ ) of carvacrol with 1 mmole (94  $\mu\text{L}$ ) of 2-bromoethyl methyl ether, and 0.66 mmole (37 mg) of potassium hydroxide in acetonitrile at 90 °C for 1 h. Following this, water was added, and the product was extracted using a mixture of *n*-hexane and ethyl acetate (1 : 1 v/v). The organic phase was dried over anhydrous sodium sulphate and dried under heat. Purification was performed using preparative thin-layer chromatography using

a mobile phase consisting of *n*-hexane and ethyl acetate (2 : 1 v/v,  $R_f = 0.72$ ) yielding a colorless oil (30.3 mg, 0.146 mmole, 44.24%).

MS calculated: 208.146, found: 208.2.

GC AUC: >99%.

$^1\text{H}$  NMR (500 MHz,  $\text{CDCl}_3$ )  $\delta$  7.11 (1H, d,  $J = 7.4$  Hz, H-3), 6.80 (1H, bd,  $J = 7.6$  Hz, H-4), 6.77 (1H, bs, H-6), 4.19 (2H, m, H-1'), 3.83 (2H, m, H-2'), 3.53 (3H, s, H-3'), 2.94 (1H, m, H-7), 2.27 (3H, s, H-10), 1.29 (6H, d,  $J = 7.1$  Hz, H-8, H-9).

$^{13}\text{C}$  NMR (125 MHz,  $\text{CDCl}_3$ )  $\delta$  15.91 (C-10), 24.19 (C-8, C-9), 34.16 (C-7), 59.35 (C-3'), 67.73 (C-2'), 71.34 (C-1'), 109.95 (C-2), 118.43 (C-4), 124.39 (C-6), 130.51 (C-5), 147.88 (C-3), 156.94 (C-1).

#### 2.4 Preparation of 1-(2-cyclohexyl-ethoxy)-2-isopropyl-5-methyl-benzene (TH)

This compound was synthesized by reacting 0.33 mmole (50 mg) of thymol with 0.66 mmole (37 mg) of potassium hydroxide and 0.66 mmole of (103.3  $\mu\text{L}$ ) 1-bromo-2-cyclohexylethane in acetonitrile for at 90 °C for 1 hour. After this, water was added and the product was extracted by adding a mixture of ethyl acetate and *n*-hexane (1 : 1 v/v). The organic phase was dried using anhydrous sodium sulphate and dried under heat. Preparative thin-layer chromatography was used to purify the compound with a mobile phase of *n*-hexane and ethyl acetate (2 : 1 v/v,  $R_f = 0.73$ ). The product was collected as a colorless oil (39.1 mg, 0.15 mmole, 45.45%).

MS calculated: 260.214, found: 260.3.

GC AUC: >99%.

$^1\text{H}$  NMR (500 MHz,  $\text{CDCl}_3$ )  $\delta$  7.16 (1H, d,  $J = 7.5$  Hz, H-3), 6.80 (1H, bd,  $J = 6.5$  Hz, H-4), 6.73 (1H, bs, H-6), 4.05 (2H, t,  $J = 6.9$  Hz, H-1'), 3.38 (1H, m, H-7), 2.39 (3H, s, H-10), 1.27 (6H, d,  $J = 6.7$  Hz, H-8, H-9 overlapped), 1.05, 1.34, 1.62, 1.78, 1.85 (H-2'–H-8').

$^{13}\text{C}$  NMR (125 MHz,  $\text{CDCl}_3$ )  $\delta$  21.43 (C-7), 22.82 (C-8, C-9), 26.38 (C-10), 65.76 (C-1'), 26.65, 33.37, 34.74, 36.87 (C-2'–C-8'), 112.14 (C-6), 120.84 (C-4), 125.82 (C-3), 134.08 (C-2), 136.26 (C-5), 156.24 (C-1).

#### 2.5 Preparation of 1-(2-cyclohexyl-ethoxy)-3-isopropyl-6-methyl-benzene (CH)

This compound was synthesized by reacting 0.33 mmole (52  $\mu\text{L}$ ) of carvacrol with 0.66 mmole (37 mg) of potassium hydroxide and 0.66 mmole of (103.3  $\mu\text{L}$ ) 1-bromo-2-cyclohexylethane in acetonitrile for 1 hour at 90 °C. Following this, water and a mixture of *n*-hexane and ethyl acetate (1 : 1 v/v) were added to the reaction, and the organic phase was collected, dried using anhydrous sodium sulphate, then condensed under heat. Preparative TLC was used to purify the product using a mobile phase of *n*-hexane and ethyl acetate (2 : 1 v/v,  $R_f = 0.73$ ). The product was collected as a colorless oil (38.7 mg, 0.149 mmole, 45.03%).

MS calculated: 260.214, found: 260.2.

GC AUC: >99%.

$^1\text{H}$  NMR (500 MHz,  $\text{CDCl}_3$ )  $\delta$  7.13 (1H, d,  $J = 7.5$  Hz, H-5), 6.80 (1H, bd,  $J = 7.6$  Hz, H-4), 6.78 (1H, bs, H-2), 4.08 (2H, t,  $J =$

6.5 Hz, H-1'), 2.95 (1H, m, H-7), (3H, s, H-10), (6H, d,  $J = 6.7$  Hz, H-8, H-9 overlapped), 1.06, 1.62, 1.79, 1.78, 1.87 (H-2'–H-8').

$^{13}\text{C}$  NMR (125 MHz,  $\text{CDCl}_3$ )  $\delta$  15.98 (C-7), 24.25 (C-8, C-9), 34.26 (C-7), 26.41, 26.66, 33.44, 34.82, 36.91 (C-2'–C-8'), 65.84 (C-1'), 109.38 (C-2), 117.77 (C-4), 124.16 (C-6), 130.38 (C-5), 147.86 (C-3), 157.26 (C-1).

#### 2.6 Preparation of acetic acid 2-isopropyl-5-methyl-phenyl ester (TA)

This reaction was conducted by reacting 0.666 mmole (100 mg) thymol with 2.663 mmole (189  $\mu\text{L}$ ) acetyl chloride and 2.663 mmole (370  $\mu\text{L}$ ) triethylamine in anhydrous THF at room temperature. Following this immediate reaction, water was added, and the product was extracted using a mobile phase of *n*-hexane and ethyl acetate (2 : 1 v/v). The organic phase was dried using anhydrous sodium sulphate, then dried under heat. Purification was performed using preparative TLC and a mobile phase of *n*-hexane and ethyl acetate (2 : 1 v/v,  $R_f = 0.49$ ) to yield a colorless oil (37.6 mg, 0.196 mmole, 29.37%).

MS calculated: 192.115, found: 192.1.

GC AUC: >99%.

$^1\text{H}$  NMR (500 MHz,  $\text{CDCl}_3$ )  $\delta$  7.26 (1H, d,  $J = 7.4$  Hz, H-3), 7.09 (1H, bd,  $J = 6.5$  Hz, H-4), 6.88 (1H, bs, H-6), 3.04 (1H, m, H-7), 2.37 (3H, s, H-10), 2.38 (3H, s,  $\text{OCOCH}_3$ ), 1.27 (6H, d,  $J = 6.6$  Hz, H-8, H-9).

$^{13}\text{C}$  NMR (125 MHz,  $\text{CDCl}_3$ )  $\delta$  20.88 (C-7), 20.99 ( $\text{OCOCH}_3$ ), 23.11 (C-8, C-9), 27.19 (C-10), 122.80 (C-6), 126.52 (C-4), 127.25 (C-3), 136.63 (C-2), 137.05 (C-5), 147.92 (C-1), 169.88 ( $\text{OCOCH}_3$ ).

#### 2.7 Preparation of acetic acid 3-isopropyl-6-methyl-phenyl ester (CA)

Synthesis of this compound was carried out by reacting 0.647 mmole (102  $\mu\text{L}$ ) of carvacrol with 2.588 mmole (184  $\mu\text{L}$ ) acetyl chloride in tetrahydrofuran with 2.588 mmole (360  $\mu\text{L}$ ) triethylamine. The reaction is completed at room temperature and within seconds. Following this, water is added and the product is extracted with a mixture of *n*-hexane and ethyl acetate (2 : 1 v/v), dried using anhydrous sodium sulphate, then condensed under heat. Purification was carried out using preparative TLC and a mobile phase consisting of *n*-hexane and ethyl acetate (2 : 1 v/v,  $R_f = 0.49$ ) to yield the product as a colorless oil (24.8 mg, 0.129 mmole, 19.94%).

MS calculated: 192.115, found: 192.2.

GC AUC: >99%.

$^1\text{H}$  NMR (500 MHz,  $\text{CDCl}_3$ )  $\delta$  7.20 (1H, d,  $J = 7.8$  Hz, H-3), 7.08 (1H, bd,  $J = 7.8$  Hz, H-4), 6.93 (1H, bs, H-6), 2.96 (1H, m, H-7), 2.36 (3H, s, H-10), 2.20 (3H, s,  $\text{OCOCH}_3$ ), 1.29 (6H, d,  $J = 7.0$  Hz, H-8, H-9).

$^{13}\text{C}$  NMR (125 MHz,  $\text{CDCl}_3$ )  $\delta$  15.82 (C-10), 20.87 ( $\text{OCOCH}_3$ ), 23.95 (C-8, C-9), 33.60 (C-7), 119.81 (C-2), 124.24 (C-4), 127.22 (C-6), 130.93 (C-5), 148.11 (C-3), 149.32 (C-1), 169.37 ( $\text{OCOCH}_3$ ).

#### 2.8 Preparation of 4-nitro-benzoic acid 2-isopropyl-5-methyl-phenyl ester (TN)

This compound was prepared by reacting 0.666 mmole (100 mg) thymol, 1.332 mmole (247 mg) 4-nitrobenzoyl chloride, and



1.294 mmole (180  $\mu$ L) triethylamine in anhydrous THF at room temperature. Following this, water and a mixture of *n*-hexane and ethyl acetate (4 : 1 v/v) were added, and the organic phase was collected, then dried using anhydrous sodium sulphate. The mixture was condensed under heat, then purified using preparative TLC using a mobile phase consisting of *n*-hexane and ethyl acetate (4 : 1 v/v,  $R_f$  = 0.62) to yield a colorless oil (47.8 mg, 0.16 mmole, 23.98%).

MS calculated: 299.1158, found: 299.1.

HPLC AUC: 96.96%.

$^1\text{H}$  NMR (500 MHz,  $\text{CDCl}_3$ )  $\delta$  8.42 (4H, m, 4-nitro-benzoyl), 7.30 (1H, d,  $J$  = 7.0 Hz, H-3), 7.14 (1H, bd,  $J$  = 6.4 Hz, H-4), 6.99 (1H, bs, H-6), 3.04 (1H, m, H-7), 2.39 (3H, s, H-10), 1.25 (6H, d,  $J$  = 6.7 Hz, H-8, H-9).

$^{13}\text{C}$  NMR (125 MHz,  $\text{CDCl}_3$ )  $\delta$  20.90 (C-7), 23.09 (C-8, C-9), 27.35 (C-10), 122.54 (C-6), 123.84 (C-3', C-5'), 126.73 (C-4), 127.73 (C-3), 131.29 (C-2', C-6'), 135.00 (C-2), 136.96 (C-5), 147.76 (C-4'), 150.91 (C-1), 163.60 (C=O).

## 2.9 Preparation of 4-nitro-benzoic acid 3-isopropyl-6-methyl-phenyl ester (CN)

This analogue was prepared by reacting 0.647 mmole (102  $\mu$ L) of carvacrol, 0.776 mmole (144 mg) 4-nitrobenzoyl chloride, and 1.294 mmole (180  $\mu$ L) triethylamine in anhydrous THF at room temperature. Following this, water was added, and the product was collected using an organic phase composed of *n*-hexane and ethyl acetate (4 : 1 v/v,  $R_f$  = 0.62). After drying using anhydrous sodium sulphate, the mixture was condensed under heat, then purified using preparative TLC and a mobile phase of *n*-hexane and ethyl acetate (4 : 1 v/v) to yield a colorless oil (33.2 mg, 0.111 mmole, 17.16%).

MS calculated: 299.1158, found: 299.1.

HPLC AUC: 96.61%.

$^1\text{H}$  NMR (500 MHz,  $\text{CDCl}_3$ )  $\delta$  8.43 (4H, m, 4-nitro-benzoyl), 7.25 (1H, d,  $J$  = 7.7 Hz, H-3), 7.13 (1H, bd,  $J$  = 7.6 Hz, H-4), 7.04 (1H, bs, H-6), 2.95 (1H, m, H-7), 2.23 (3H, s, H-10), 1.29 (6H, d,  $J$  = 7.0 Hz, H-8, H-9).

$^{13}\text{C}$  NMR (125 MHz,  $\text{CDCl}_3$ )  $\delta$  15.88 (C-10), 23.95 (C-8, C-9), 33.64 (C-7), 119.58 (C-2), 123.79 (C-3', C-4'), 124.76 (C-4), 127.09 (C-6), 131.30 (C-2', C-6'), 134.98 (C-5), 148.44 (C-3), 149.09 (C-1), 150.89 (C-4'), 163.11 (C=O).

## 2.10 *In vitro* anticancer activity screening

Anticancer activity was assessed based on a sulforhodamine-B assay and a variety of cancer cell lines of different origins including: A375 (melanoma), A549 (alveolar basal epithelial cell adenocarcinoma), DU145 (prostate cancer), HeLa (epithelial-like cervical cancer cells), Hep2 (head and neck tumor epithelial cell), HepG2 (Hepatocellular carcinoma), HT29 (colorectal adenocarcinoma), MCF7 (breast adenocarcinoma), PANC1 (pancreatic ductal carcinoma), and SCO3 (ovarian adenocarcinoma). Cancer cell lines were acquired from Nawah Scientific Inc., (Mokatam, Cairo, Egypt). Cells were maintained in DMEM (A549, Hep2, HepG2, A375DU145, MCF7) or RPMI (HT29, PANC1, SCO3, HeLa) media including streptomycin (100 mg  $\text{mL}^{-1}$ ), penicillin (100 units per mL), and 10% fetal bovine serum in

humidified, 5% (v/v)  $\text{CO}_2$  atmosphere at 37  $^\circ\text{C}$ . 100  $\mu\text{L}$  cell suspension ( $5 \times 10^3$  cells) were transferred to 96-well plates and incubated in corresponding media for 24 hours. Following this, cells were treated with additional media (100  $\mu\text{L}$ ) containing drugs at 10 and 100  $\mu\text{M}$  concentrations. After 48 hours, media were replaced by fresh media containing 150  $\mu\text{L}$  10% TCA, then incubated for 1 hour at 4  $^\circ\text{C}$  to fix the cells. Following this, TCA-containing media were removed, and the cells were washed 5 times with distilled water. After this, aliquots of 70  $\mu\text{L}$  SRB solution (0.4% w/v) were added and incubated at room temperature for 10 minutes away from direct light. Following this, cells were washed with 1% acetic acid 3 times, and were left to dry overnight. Next, 150  $\mu\text{L}$  of TRIS solution (10 mM) was added to dissolve bound SRB stain. Absorbance was measured using an Infinite F50 microplate reader at 540 nm (TECAN, Switzerland). Viability was calculated relative to control (average of 3 wells), and error was calculated as standard deviation. Doxorubicin was tested for comparison.

## 2.11 Determination of physicochemical and pharmacokinetic properties

Physicochemical properties and pharmacokinetic interaction predictions were obtained using the SwissADME database, which computes these parameters based on structural similarities.<sup>20</sup>

## 2.12 Virtual screening of cancer-related genes

Identification of cancer-related genes was predicted by using the GeneCards® The Human Gene Database, using the key term “cancer” to identify cancer-related genes.<sup>21</sup> Microsoft Excel spreadsheet was utilized to export and manage data for further study.

## 2.13 Virtual screening of compounds' potential gene targets

Possible gene targets of the parent and synthesized analogues were identified by utilizing the “SwissTargetPrediction” database.<sup>22</sup> Predictions are based on chemical structure similarity and the number of similar compounds to other known molecules indexed within the database, and a probability score is given on that basis. All gene targets with a probability higher than 0 were considered for this study.

## 2.14 Identification of overlapping genes between cancer and the test compounds

Detection of common gene targets between the test compounds and cancer was performed using Venn diagrams (Venny 2.1.0 online database).<sup>23</sup> Overlapping genes for all test compounds as a whole, and for individual compounds were highlighted.

## 2.15 Enrichment analysis of molecular function pathways

Analysis of the cancer-related genes overlapping with the most active compounds was performed based on gene ontology (GO) to determine the molecular functions of these genes. This analysis was conducted by the ShinyGO database.<sup>24</sup> The data acquired takes into consideration the molecular functions, the number of genes, and the statistical significance, defined as



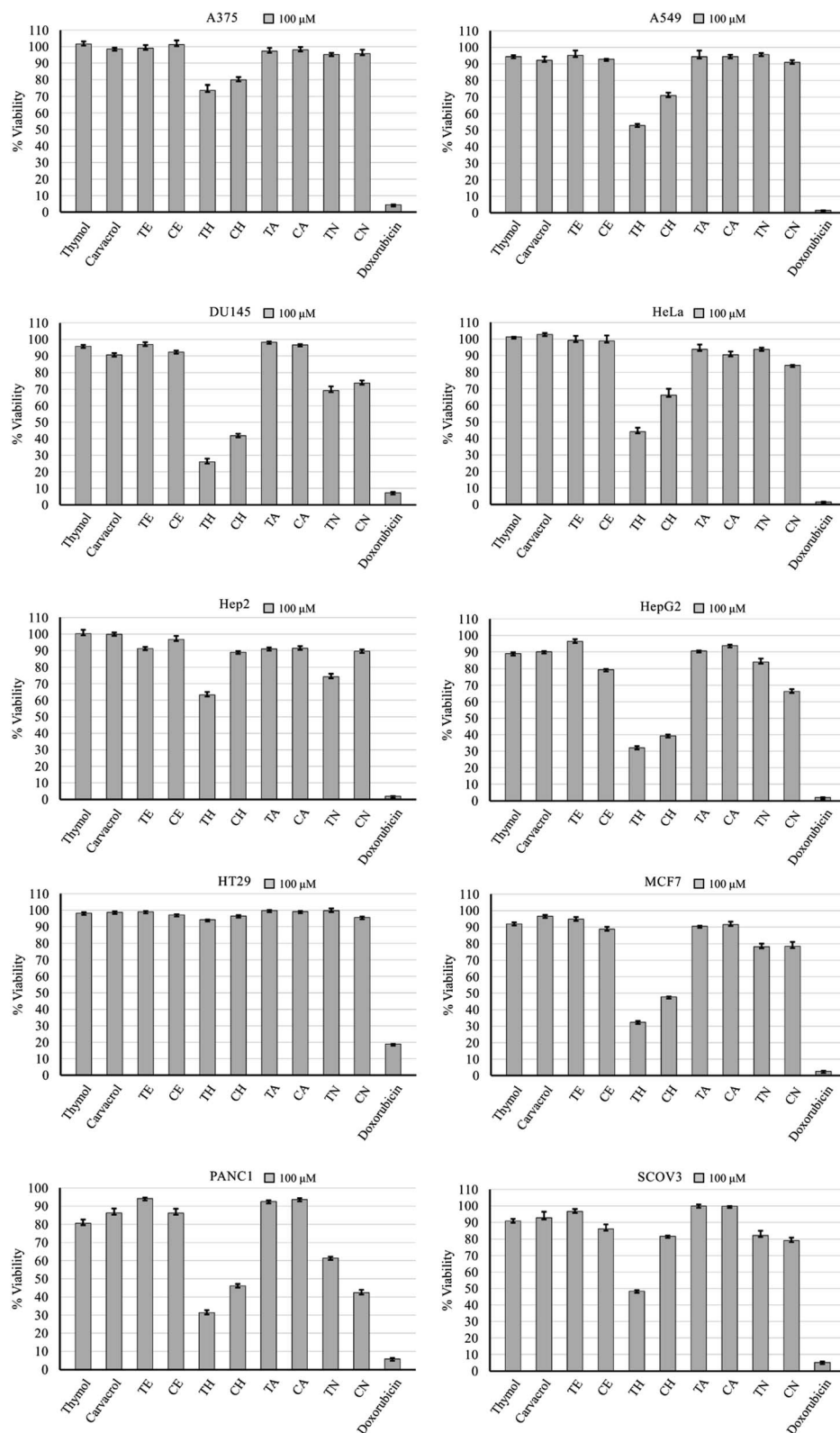


Fig. 2 Anticancer activity of test compounds and doxorubicin against 10 cell lines after 48 hour treatment at 100  $\mu\text{M}$ . Error bars: standard deviation.

false discovery rate (FDR), where a lower FDR indicates a stronger prediction of the involvement of the genes in the corresponding molecular function.

## 2.16 Analysis of protein–protein interactions

Gene targets of the most active compounds (TH and CH) were assessed for potential protein–protein interactions (PPIs) by



utilizing the “STRING: functional protein association networks” database.<sup>25</sup> This analysis helps identify core cancer-related gene targets of the test compounds. All genes with a confidence score  $\geq 0.4$  were considered for this study.

### 2.17 Network construction

To further analyze molecular interactions between the genes, and identify the genes with the highest relation to cancer and the most active test compounds (TH and CH), a network of the previously identified PPI genes was constructed by the Cytoscape bioinformatics software 3.10.1.<sup>26</sup> This offers a comprehensive overview of the highest potential cancer-related, and compound-related genes.

### 2.18 Molecular docking

Compounds TH and CH were considered for molecular docking within the highest potential, cancer-related gene target from the PPI data. Test compounds were drawn in ChemDraw Ultra 7.0 and saved in .Mol format. Before docking, the molecular structures of compounds energy minimized and converted into .pdb using BIOVIA Discovery Studio Visualizer 2019 tool. The crystal structure of the top anticancer core target obtained from the PPI results; AKT1 (PDB ID: 3o96) was downloaded from the Protein Data Bank (PDB) in PDB format.<sup>27</sup> The protein structure was prepared by removing any water molecules and co-crystallized ligands – compounds that may bind to the protein. The grid-box with dimension of 20 Å was generated to cover all essential residues within the active site of AKT1 using Autodock tools (center\_x = 8.018 Å, center\_y = -7.694 Å, center\_z = 11.973 Å). The docking process was carried out using Autodock Vina software.<sup>28</sup> Following this, the compounds were converted into .pdbqt format, which is compatible with the Autodock Vina software. Finally, results were visualized and analyzed using BIOVIA Discovery Studio Visualizer 2019 and Pymol programs.

## 3. Results and discussion

### 3.1 Synthesis

The synthesis of the ether bond-containing analogues (TE, CE, TH, and CH) was performed *via* “Williamson ether synthesis”.

These analogues form successfully in anhydrous tetrahydrofuran containing potassium hydroxide and the corresponding alkyl bromides. Interestingly, synthesis of other analogues using alkyl chlorides proved difficult, even with modulation of reaction conditions (temperature and time) and molar ratios. The synthesis of the ester-containing analogues (TA, CA, TN, and CN) was rapidly performed in anhydrous acetonitrile containing triethylamine and the corresponding acid chlorides. In general, the proximity of the reacting phenolic hydroxy to the isopropyl moiety in carvacrol did not show an apparent effect on the product yields when compared to the thymol analogues.

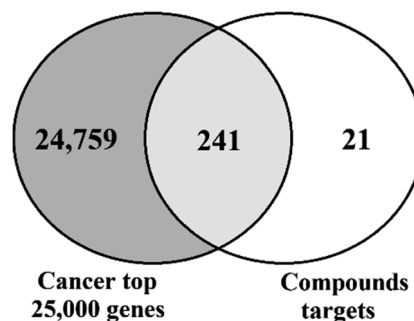


Fig. 3 The number of common genes between the test compounds and cancer.

Table 2 The number of compounds gene targets overlapping with cancer as for individual compounds

	Gene targets	Overlapping with 25 000 cancer-related genes
Thymol	27	27
Carvacrol	23	20
TE	48	46
CE	45	43
TH	28	26
CH	28	25
TA	46	40
CA	33	31
TN	93	84
CN	100	93
All compounds	262	241

Table 1 Anticancer activity average, physicochemical properties, and computational pharmacokinetic properties predictions

	Cell viability average	log P	H-bond acceptors	H-bond donors	Pgp substrate	CYP1A2 inhibitor	CYP2C19 inhibitor	CYP2C9 inhibitor	CYP2D6 inhibitor	CYP3A4 inhibitor
Thymol	94.38%	2.82	1	1	No	Yes	No	No	No	No
Carvacrol	94.83%	2.8	1	1	No	Yes	No	No	No	No
TE	96.27%	3.17	2	0	No	Yes	No	No	Yes	No
CE	91.97%	3.19	2	0	No	Yes	No	No	Yes	No
TH	49.85%	5.18	1	0	No	Yes	No	No	Yes	No
CH	65.95%	5.25	1	0	No	Yes	No	No	Yes	No
TA	94.79%	3.02	2	0	No	No	No	No	No	No
CA	94.90%	3.1	2	0	No	No	No	No	No	No
TN	83.41%	3.5	4	0	No	Yes	Yes	Yes	No	No
CN	79.59%	3.46	4	0	No	Yes	Yes	Yes	No	No



### 3.2 Anticancer and pharmacokinetic properties

Cell viability after a 48 hour incubation at a concentration of 100  $\mu$ M revealed compounds TH and CH to be the most active

following doxorubicin which proved to be potent at that concentration (Fig. 2). In some cell lines, the nitrobenzene derivatives (TN and CN) had some anticancer activity.

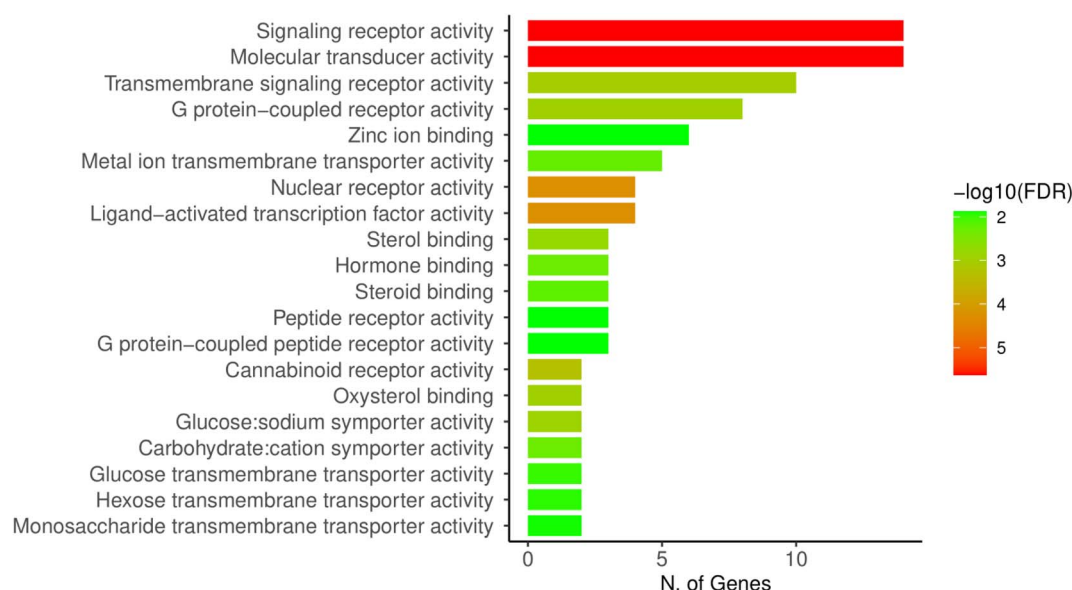


Fig. 4 ShinyGO analysis of molecular functions of the cancer-related gene targets of TH and CH.

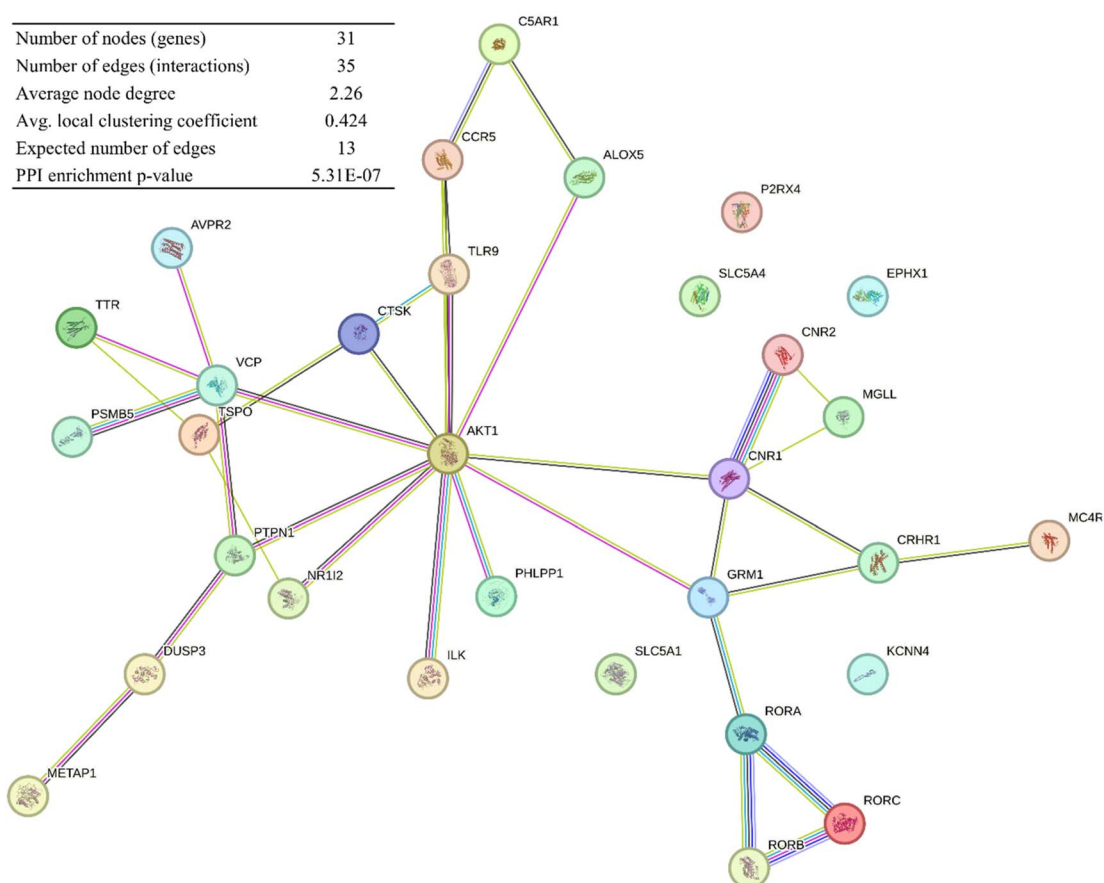


Fig. 5 PPI network of compounds TH and CH cancer-related gene targets constructed by the STRING database.



Furthermore, some cell lines displayed high resistance such as A375 and HT29, while others showed more susceptibility such as HepG2, PANC1, MCF7, and DU145. Testing at a concentration of 10  $\mu$ M did not show any note-worthy anticancer activity, with the exception of doxorubicin (ESI†).

The cyclohexyl analogues (TH and CH) demonstrated the highest anticancer activity on average, followed by the *para*-nitrobenzene analogues (Table 1). The cyclohexyl moiety has been reported previously to induce this effect.<sup>29</sup> Data retrieved from the SwissADME database predicts no interaction with P-glycoprotein, which is a cancer-related, non-specific efflux pump.<sup>30</sup> Pharmacokinetic and physicochemical properties had no apparent link with the observed anticancer activity of compounds TH and CH, except for lipid solubility (log *P*), which was the highest in these two analogues. This may play a role in the observed anticancer activity, but further investigation is required.

### 3.3 Cancer-related and potential compounds targets

The top 25 000 cancer-related genes were retrieved from the GeneCards database, which utilizes data for over 350 000 genes to detect genes related to the search query, which was the term “cancer” for this study. The potential gene targets of the test compounds were identified using the SwissTargetPrediction database, which identifies possible targets based on

a probability score that is proportional to degree of structural similarity with other known molecules within the database. This probability score is also proportional to the number of similar molecules as well. A total of 262 possible gene targets of the test compounds were used for further study. By utilizing Venn diagrams, 241 common genes between cancer and all the test compounds as whole were identified (Fig. 3).

Interestingly, when considering individual compound targets, the data revealed the most active compounds (TH and CH) to have the least number of possible cancer-related targets compared to the other semi-synthetic analogues (Table 2). Since compounds TH and CH had the most anticancer activity, only their gene targets will be considered for the following steps. Full lists of genes are in the ESI section.†

### 3.4 Enrichment analysis of molecular function pathways

Enrichment analysis of the overlapping genes between cancer and compounds TH and CH revealed a high number of genes (14) relating to various signaling receptors which is a wide category including membrane receptors for neurotransmitters, cytokines, and nuclear receptors as well (Fig. 4).

In addition, molecular transduction was also found to be a molecular function linked to a high number of genes (14). This class of activity also includes a wide variety of receptors

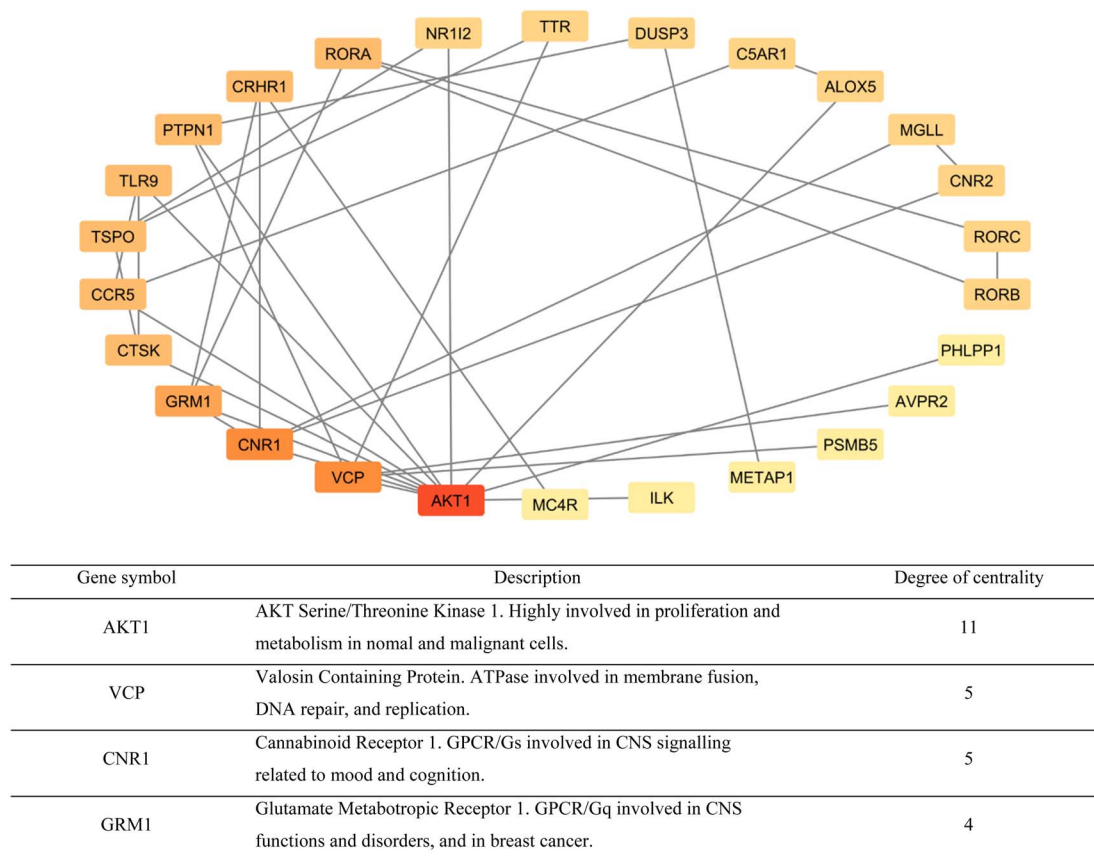


Fig. 6 Cytoscape network of protein–protein interactions highlighting known interactions between the cancer-related targets of compounds TH and CH (from red to light yellow: highest to lowest). In addition, a brief description of the top 4 genes based on degree of centrality (bottom).



and biological effector functions, and is often overlapping with the “signaling receptor activity” category.

### 3.5 Protein–protein interactions and network construction

A network of the cancer-related, and potential compound TH and CH target genes (total of 31) was constructed using the STRING database (Fig. 5). This is performed to highlight known

interactions within these genes. This analysis had a small PPI enrichment  $p$ -value of  $5.31 \times 10^{-7}$ , indicating a significant relationship between some of these genes.

A network of the previous PPI genes was constructed using Cytoscape software to highlight the genes with the most known interactions to other genes, totaling 26 genes and excluding 5 genes with no known interactions (Fig. 6). Based on the degree

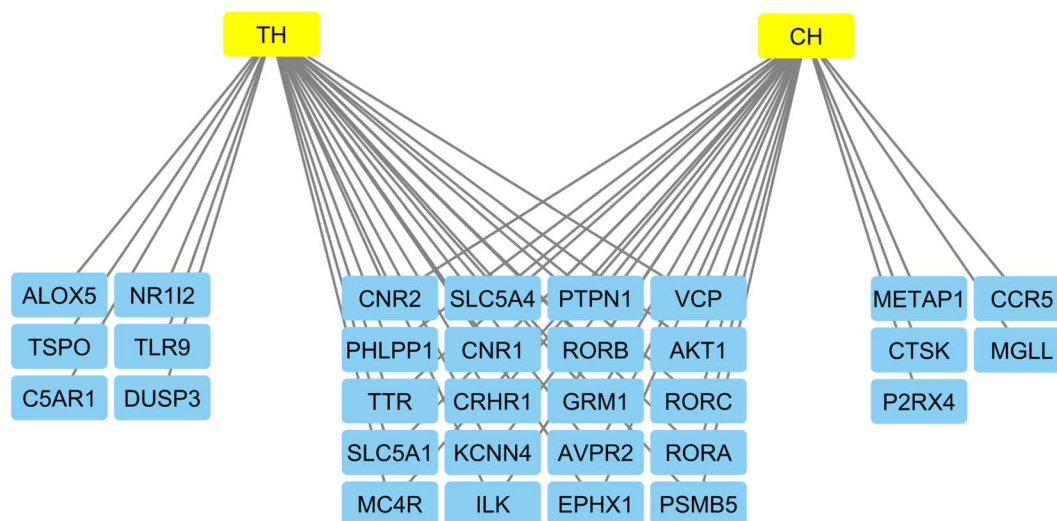


Fig. 7 Network of gene targets of the most active compounds constructed by the Cytoscape software to highlight common, and exclusive targets of both TH and CH compounds.

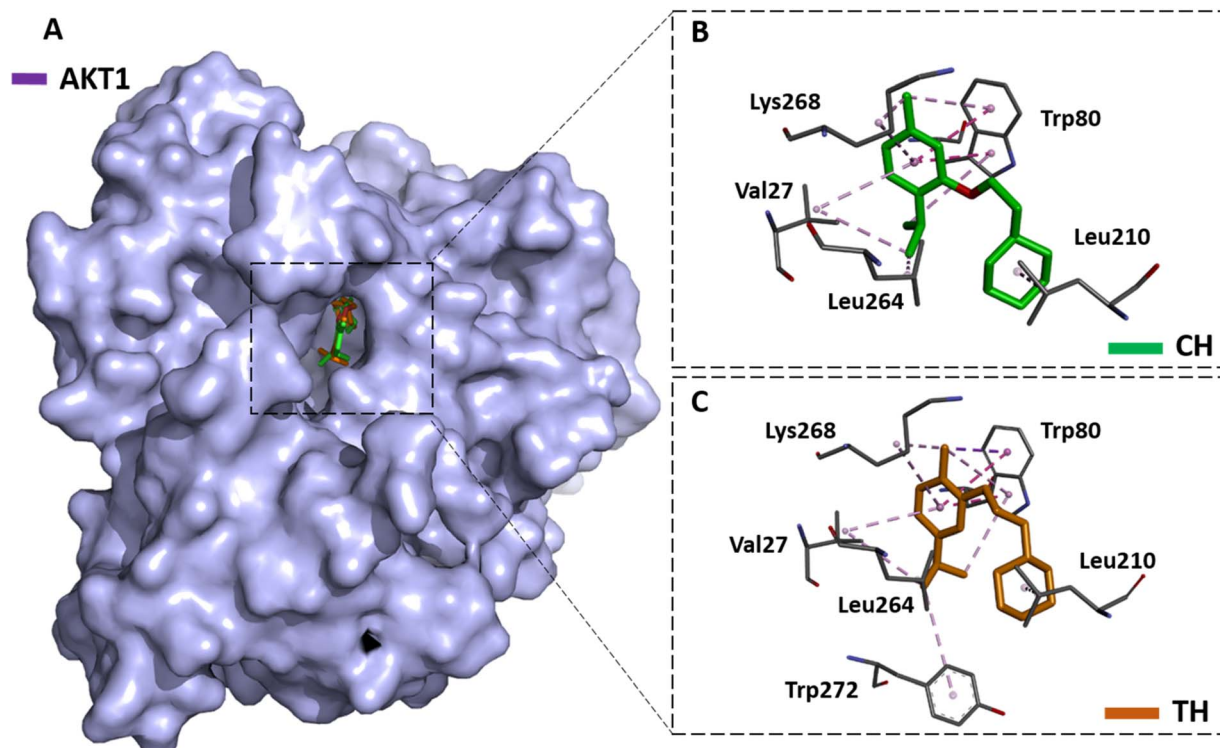


Fig. 8 Docking and interaction mechanism of CH and TH with AKT1. (A) Binding mode of CH (green) and TH (orange) inside the active site of AKT1 (purple). (B) Amino acid interactions with CH. (C) Amino acid interactions with TH.



of centrality, which represents high interaction with other genes, the gene encoding AKT1 was found to be the most important, which is a protein kinase highly involved in the regulation of cell division in normal and cancer states.<sup>31</sup> Other prominent genes within this network are highlighted in Fig. 5 as well.

The Cytoscape software was used to display a network of the gene targets of compounds TH and CH to highlight common, and exclusive, gene targets of each (Fig. 7). Interestingly, the top 4 genes from the previous PPI network were common to both compounds. Furthermore, the slight structural difference between compounds TH and CH was able to elicit some differences in potential biological targets. This highlights the importance of testing structurally similar analogues to better understanding the corresponding alteration of potential biological targets.

### 3.6 Molecular docking

The top anti-cancer core target (AKT1) was molecularly docked with the two compounds TH and CH. Both compounds adapted a stable conformation deeply inside the active site of AKT1 (Fig. 8A). In terms of interaction, CH formed multiple hydrophobic interactions with Val27, Trp80, Leu210, Leu264, Lys268 within the active site of AKT1 (Fig. 8B). Similarly, TH interacts with Val27, Trp80, Leu210, Leu264, Lys268 and Trp272 *via* hydrophobic bonds at the active site chamber (Fig. 8C). Additionally, both molecules exhibit strong binding ability towards AKT1. The binding energy scores of CH and TH were  $-8.8$  and  $-9.0$  kcal mol<sup>-1</sup>, respectively.

## 4. Conclusion

The synthesis of various thymol and carvacrol analogues was performed to test *in vitro* anticancer activity and to identify commonality and differences in potential biological targets related to cancer. Within the test compounds, the cyclohexyl-ethane variants (TH and CH) displayed the highest anticancer activity when compared to the other analogues. Computational methods identified gene targets of the test compounds which were also cancer-related. The analysis of these genes revealed that the most central of them was AKT1, which was reported to be highly involved in proliferation and cancer. Furthermore, structural differences between the most active compounds revealed differences in some biological targets. Molecular docking study of compounds TH and CH revealed that they localize within a deep binding pocket within the AKT1 protein with strong binding characteristics facilitated *via* interaction with several residues within the protein. Taken collectively, thymol and carvacrol may have potential as anticancer agents if modified accordingly, and the observed anticancer activity could be mediated *via* interaction with AKT1 protein. Lastly, the use of network pharmacology and molecular docking approaches can help assess, and guide conventional SAR studies to achieve more potent analogues, and to better understand the biological targets and molecular functions involved.

## Data availability

The data supporting this article have been included as part of the ESI.†

## Conflicts of interest

There is no known financial or personal competing interest.

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