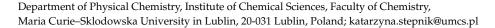




Article

Biomimetic Chromatographic Studies Combined with the Computational Approach to Investigate the Ability of Triterpenoid Saponins of Plant Origin to Cross the Blood-Brain Barrier

Katarzyna Stępnik 🗅



Abstract: Biomimetic (non-cell based in vitro) and computational (in silico) studies are commonly used as screening tests in laboratory practice in the first stages of an experiment on biologically active compounds (potential drugs) and constitute an important step in the research on the drug design process. The main aim of this study was to evaluate the ability of triterpenoid saponins of plant origin to cross the blood-brain barrier (BBB) using both computational methods, including QSAR methodology, and biomimetic chromatographic methods, i.e., High Performance Liquid Chromatography (HPLC) with Immobilized Artificial Membrane (IAM) and cholesterol (CHOL) stationary phases, as well as Bio-partitioning Micellar Chromatography (BMC). The tested compounds were as follows: arjunic acid (Terminalia arjuna), akebia saponin D (Akebia quinata), bacoside A (Bacopa monnieri) and platycodin D (Platycodon grandiflorum). The pharmacokinetic BBB parameters calculated in silico show that three of the four substances, i.e., arjunic acid, akebia saponin D, and bacoside A exhibit similar values of brain/plasma equilibration rate expressed as $logPS_{Fubrain}$ (the average $logPS_{Fubrain}$: -5.03), whereas the logPS_{Fubrain} value for platycodin D is -9.0. Platycodin D also shows the highest value of the unbound fraction in the brain obtained using the examined compounds (0.98). In these studies, it was found out for the first time that the logarithm of the analyte-micelle association constant (logK_{MA}) calculated based on Foley's equation can describe the passage of substances through the BBB. The most similar logBB values were obtained for hydrophilic platycodin D, applying both biomimetic and computational methods. All of the obtained logBB values and physicochemical parameters of the molecule indicate that platycodin D does not cross the BBB (the average logBB: -1.681), even though the in silico estimated value of the fraction unbound in plasma is relatively high (0.52). As far as it is known, this is the first paper that shows the applicability of biomimetic chromatographic methods in predicting the penetration of triterpenoid saponins through the BBB.

Keywords: triterpenoid saponins; computational studies; Quantitative Structure-Activity Relationship (QSAR); biomimetic studies; micellar liquid chromatography; IAM stationary phase



Citation: Stepnik, K. Biomimetic Chromatographic Studies Combined with the Computational Approach to Investigate the Ability of Triterpenoid Saponins of Plant Origin to Cross the Blood–Brain Barrier. *Int. J. Mol. Sci.* 2021, 22, 3573. https://doi.org/ 10.3390/ijms22073573

Academic Editor: Raffaele Capasso

Received: 11 March 2021 Accepted: 26 March 2021 Published: 30 March 2021

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1. Introduction

Neurodegenerative related diseases constitute a growing health issue in aging populations worldwide. It is estimated that the number of patients suffering from Alzheimer's disease alone was more than 35 million in 2012 and it will double by 2030 and more than triple by 2050 [1]. Therefore, one of the key research requirements is to look for substances capable of crossing the blood–brain barrier (BBB) and those that may have neuroprotective properties.

In the drug discovery process, the main goal is to explore and optimize therapeutic agents with desirable pharmacodynamic, pharmacokinetic and toxicological properties. For this purpose, predictive tools for accurate assessment of these properties are useful especially in the early development stages in the drug discovery process [2–5]. The need

for high-throughput screening has increased dramatically over the past several decades as a result of constant pressure on pharmaceutical companies to accelerate drug discovery while reducing drug development costs [3]. In this aspect, an important role is played by the biomimetic (non-cell based in vitro) and computational (in silico) methods which have been developed and improved in recent years for the prediction of compound ADME properties (absorption, distribution, metabolism, excretion) [6,7].

Nevertheless, the prediction of biological activity in itself, connected with estimation of ADME and toxicity parameters, should be based on a spectrum of in vivo, in vitro and in silico methods. In relation to the purpose of the presented studies, the experimental in vivo determination of blood-brain barrier permeability seems to be very difficult mainly because it requires complex techniques and is usually expensive and time-consuming [8–10]. Therefore, in vivo studies should be preceded by alternative tests including computational, biomimetic and neurotoxicity assays [3,4]. Such an approach is especially important because of reagent saving (Green Chemistry principles) and protection of animals used for scientific purposes (the European Community Council Directive for the Care and Use of laboratory animals of 22 September 2010 (2010/63/EU)). The Directive is firmly based on the principle of the Three Rs, to replace, reduce and refine the exploitation of animals for scientific purposes. The main aim of the European Centre for the Validation of Alternative Methods (ECVAM), a unit of the Institute for Health and Consumer Protection of the European Commission's Joint Research Centre (JRC), is active supporting of alternative methods to those in vivo, which could replace, reduce and refine the use of laboratory animals [11].

The main aim of the study was to evaluate the ability of naturally occurring triter-penoid saponins to cross the blood–brain barrier based on both computational analyses including QSAR methodology and biomimetic studies using adequate liquid chromatographic techniques. These studies precede in vivo experiments which can be the subject of further studies. The tested compounds were as follows: arjunic acid (*Terminalia arjuna*), akebia saponin D (*Akebia quinata*), bacoside A (*Bacopa monnieri*) and platycodin D (*Platycodon grandiflorum*).

There are a few papers on the permeability of the tested triterpenoid saponins through the BBB; however, the studies were not based on both in silico and non-cell based in vitro methods [12–18]. Triterpenoid saponins were selected for this research because they have a broad spectrum of biological activity. For example, numerous bioactive saponins isolated from *Terminalia arjuna* (*Combreatceae*) have been reported to have antioxidant, anti-ischemic, antihypertensive, antihypertrophic and other effects [19–27]. Due to their pharmacological properties, they are used in pharmacy and medicine. In the presented studies the applicability of the biomimetic chromatographic methods in predicting the BBB-permeation potential of triterpenoid saponins was shown for the first time.

In recent years there has also been an increase in interest in the non-cell based in vitro methods including chromatographic methods, that do not use the real cell lines but whose systems (mobile or stationary phase) provide a simple model of the biological barrier. The following methods play an important role in this regard i.e., Bio-partitioning Micellar Chromatography (BMC), High Performance Liquid Chromatography (HPLC) with the Immobilized Artificial Membrane (IAM), and cholesterol-bonded-silica stationary phase (CHOL).

The unique properties of the microvasculature of the central nervous system (CNS) are characterized by the concept of the blood-brain barrier (BBB) [28]. The BBB, composed of many cell types, is the dynamic interface between the blood and the brain tissue whose task is to maintain the tightly controlled microenvironment of the brain [29]. This is a diffusion barrier that is essential for the normal functioning of the central nervous system [30]. In other words, due to the BBB's endothelial cells, the brain is partitioned from the peripheral circulation, thus regulating CNS homeostasis providing the flux of relevant substances from the bloodstream, e.g., oxygen and glucose, and protecting the CNS against neurotoxins, inflammation, injuries and diseases [28,31].

Both the paracellular (between the adjacent cells) and transcellular (through the cells) pathways can occur in the passage of molecules across the BBB endothelium cells [32]. The paracellular pathway is followed by small, usually hydrophilic molecules and ions in accordance with their size and charge [33]. It is difficult for such molecules to partition into the cell membranes, therefore they cannot cross the BBB via the transcellular pathway [34]. These substances can simply diffuse between the adjacent cells down their concentration gradient; however, the diffusion is limited by the presence of tight junctions placed at the outermost end of the intercellular space [33]. Instead, the small hydrophobic drugs favor the transcellular pathway because they can partition into the cell membranes [34]. Different mechanisms are involved in the transcellular pathway, i.e., the passive diffusion of lipophilic compounds, receptor-mediated shuttling, and transcytosis [35,36]. Some molecules such as oxygen, CO₂, alcohol, and steroid hormones can freely penetrate the BBB transcellularly by diffusion and dissolving in the lipid plasma membrane [37,38]. There are also the other mechanisms, i.e., the specific receptor mediated or vesicular mechanisms which are used by almost all other substances [37]. Hydrophilic molecules may enter the brain using specific transport mechanisms [39].

The endothelial cells of brain microvasculature which tend to form tight junctions are the anatomical constituents of the BBB. The neurovascular unit are, in turn, constructed by the endothelial cells with pericytes, astrocytes, oligodendrocytes, microglia, and neurons [40]. It is also worth emphasizing that a key role in the development of microcirculation is played by pericytes, being embedded in the basement membrane of brain capillaries [41,42].

The bulk of the current computational and biomimetic methods of determination of a substance permeability through the BBB is based on a pharmacokinetic parameter, i.e., the brain/blood partitioning in the steady state, expressed as logBB. This parameter is defined as the logarithmic ratio between the concentration of a substance in brain and its concentration in blood [43]:

$$logBB = log(conc. in brain/conc. in blood)$$
 (1)

In the early stages of the neuroprotective drug discovery process, it is necessary to study the ability of various substances to cross the blood–brain barrier. This property should be treated as a key factor for further research including in vivo [44]. In this investigation the relationships between the logBB values and various partition indices were examined. This is crucial to be able to compare their possible effectiveness in describing the BBB passage.

Bio-partitioning chromatography is a mode of micellar liquid chromatography (MLC) in which a mobile phase is composed of non-ionic surfactant—poly-oxyethylene (23) lauryl ether, Brij35, above the critical micellar concentration (CMC) in order to form micelles [45,46]. The Brij35 micelle is assumed to be a kind of simple, chemical model of the bio-membrane. This composition of the chromatographic system makes BMC useful in modelling various biological behaviour of different kinds of drug [47–53]. The applicability of BMC in predicting biological activity of compounds can be attributed to the similarities between the BMC systems and biological barriers as well as extracellular fluid [47]. Therefore, the retention of a compound in BMC reflects appropriately the bio-partitioning process, i.e., the solute partitioning into the lipid bilayers of biological membranes [52].

The retention of compounds in the micellar chromatography depends on the type of interactions (electrostatic and/or hydrophobic), with a surfactant-modified stationary phase and micelles [54–57]. For the ionic compounds, both interactions should be considered [48]. On the other hand, retention of a substance depends also on the properties of the molecule itself, i.e., its lipophilic, steric and electronic properties, being the most important parameters governing the transport and drug—receptor interactions [58].

Due to the everlasting development of dynamic combinatorial/covalent chemistry (DCC), it is possible to generate a wide range of structurally diverse compounds through a

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systematic, repetitive and covalent combination of various "building blocks" [59]. Both small molecule receptor binders and larger biomimetic macromolecules can be produced using the DCC technique with particular three-dimensional structural architectures [60]. More realistic biomimetic chromatographic models than the theoretical one are the Immobilized Artificial Membrane (IAM), as well as cholesterol immobilized on silica, based on the main constituents of eukaryotic cell membranes, i.e., analogues of phosphatidylcholine (PC) and cholesterol (CHOL), respectively [61,62]. Both, IAM and CHOL systems are increasingly used to study the biological properties of different organic compounds [63].

The retention in the IAM stationary phases results from lipophilic, electrostatic and other secondary interactions, contrary to the traditional n-octanol-water partitioning behaviour [64]. The IAM retention factors are often correlated with different kinds of biological activity and pharmacokinetic properties including ecotoxicity [65], blood-brain barrier absorption [61], bioconcentration [66], oral absorption [67], transdermal transport [68], volume of distribution [69,70], protein binding properties [69], and brain penetration [71]. Table 1 shows the important areas of biomimetic chromatographic methods applications used in this research.

Table 1. The use of Bio-partitioning Micellar Chromatography (BMC), Immobilized Artificial Membrane (IAM), and cholesterol (CHOL) chromatography to evaluate the biological activity of organic compounds.

References	Drugs	BMC/IAM System	Biological Activity	
[53]	Anticonvulsant drugs	Brij 35: 0.02 M; 0.04 M; 0.06 M; pH: 7.4	Anticonvulsant properties	
[52]	Non-steroidal anti-inflammatory drugs	Brij 35: 0.02 M; 0.04 M; 0.06 M; pH: 7.4	Anesthetic potency	
[48]	Local anesthetics	Brij 35: 0.02 M; 0.04 M; 0.06 M; pH: 7.4	Anesthetic potency	
[72]	Barbiturates	Brij35: 0.02 M; 0.04 M; 0.06 M SDS: 0.05 M; 0.1 M; 0.15 M CTAB: 0.01 M; 0.02 M; 0.05 M pH: 3.5 and 7.4	Hypnotic activity	
[73]	SDS: 0.05 M; 0.1 MeOH, EtOH, 1-pentanol pentanol pH: 2-7		β- andrenergic activity	
[74]	Brij35: 0.02 M; 0.04 M; Benzodiazepines 0.06 M pH: 7.4		Toxicity and anxiolytic activity	
[51]	Phenothiazines	Brij35: 0.02 M; 0.04 M; 0.06 M pH: 7.4	Pharmacokinetics, preclinical pharmacology, and therapeutic efficacy parameters; antipsychotic potential	
[45]	Structurally diverse drugs	Brij35: 0.04 M pH: 7.4 and 6.5	Oral absorption	

 Table 1. Cont.

References	Drugs	BMC/IAM System	Biological Activity	
[75]	Fatty acids and polyphenols	Brij35: 0.04 M; 0.06 M; 0.08 M; 0.1 M; 0.12 M + acetonitrile CTAB: 0.04 M; 0.06 M; 0.08 M; 0.1 M; 0.12 M + acetonitrile SDS: 0.04 M; 0.06 M; 0.08 M; 0.1 M; 0.12 M + acetonitrile, dioxane, tetrahydrofuran, acetone pH: 7.4	Oral, jejunum and Caco-2 absorption	
[76]	Structurally diverse drugs	Brij35: 0.04 M pH: 7.4	BBB permeability	
[77]	Phenols	Brij35: 0.06 M; 0.08 M; 0.1 M; 0.12 M + isobutanol (5% v/v) pH: 7.4	BBB permeability	
[78]	Non-steroidal anti-inflammatory drugs	Brij35: 0.04 M pH: 3.5–8	Skin permeability	
[79]	Fatty acids and polyphenols	Brij35: 0.04 M; 0.06 M; 0.08 M; 0.1 M; 0.12 M + acetonitrile CTAB: 0.04 M; 0.06 M; 0.08 M; 0.1 M; 0.12 M + acetonitrile SDS: 0.04 M; 0.06 M; 0.08 M; 0.1 M; 0.12 M + acetonitrile, dioxane, tetrahydrofuran, acetone pH: 7.4	Percutaneous absorption	
[80]	Anxiolytics, antihistamines, β-blockers, antiepileptics, antipsychotics	SDS: 0.07 M; 0.09 M pH: 7.4	Protein drug binding properties	
[81]	Structurally diverse drugs	PBS or PBS-acetonitrile: 5–25% v/v pH: 7.4	Cell permeability, human oral absorption, % plasma protein binding	
[82]	Novel β-hydroxy-β- aryl-alkanoic acids	Brij35: 0.04 M pH: 7.4	Gastrointestinal absorption	
[83]	Structurally diverse drugs	Brij35: 0.04 M pH 7.4	Blood to lung; blood to liver; blood to fat; blood to skin partition coefficients	
[84]	Newly-synthesized 17-β-carboxamide steroids	Brij35: 0.04 M pH: 5.5 and 7.5	Skin and corneal permeability	
[85]	Structurally diverse drugs	Brij35: 0.04 M pH: 7.4–7.7	Ocular tissue permeability	

 Table 1. Cont.

References	Drugs	BMC/IAM System	Biological Activity
[86]	Structurally diverse drugs	Brij35: 0.04 M pH: 7.4	BBB permeability
[87]	Benzophenone ultraviolet filters	Brij35: 0.01 M; 0.02 M; 0.03 M pH: 7.4 and 6.5	Ecotoxicity and skin permeability
[65]	Structurally diverse pesticides	Phosphate-buffered saline (PBS) or PBS-acetonitrile: 5–25% v/v pH: 7.4	Ecotoxicity
[61]	Structurally diverse compounds	Buffer- MeOH: 70:30 <i>v/v</i> pH: 7.4	BBB permeability
[66]	Structurally diverse drugs	3-/3% 71/71	
[88]	Structurally diverse drugs	Acetonitrile-buffer pH: 7.4	Interactions between the solutes and the immobilized phospholipid membranes
[67]	Structurally diverse drugs Acetonitrile-buffer: 0–30% v/v pH: 7.4		Human oral absorption
[63]	Newly-synthesized drug-like compounds	Acetonitrile-buffer pH 7.4	Blood-brain barrier permeation
[89]	Newly synthesized antiproliferative and analgesic active compounds	Acetonitrile-buffer pH 7.4	Lipophilicity

2. Results

2.1. Division of the Dataset for the QSAR Studies

The chemical structures of the investigated triterpenoid saponins are presented in Table ${\color{black} 2}.$

Table 2. The chemical structures of the tested compounds.

Name	Structure		
Arjunic acid	HO And HO CH3 HO		

Table 2. Cont.

Name	Structure
Akebia saponin D	HO OH OH OH OH OH
Bacoside A	HO HO CH ₃ HO CH ₃ HO CH ₃ HO CH ₃
Platycodin D	HO OH

The QSAR model used here (Equation (2)) was established based on my former studies to calculate the logBB values for the different group of triterpenoid saponins. Therefore, there was a reasonable assumption that the previously used model would be adequate for the currently tested compounds. The exact procedure for selecting and dividing the dataset for the QSAR analysis was precisely described in the previous paper [90].

Briefly, in order to establish a new QSAR model, the dataset comprised 40 chemically diverse compounds with corresponding experimentally determined logBB values [91] (Table S1). Among the tested compounds, 10 were selected to form the test set, whereas 30 compounds were chosen to be a training set. The division of the dataset was made several times in a random manner. The tested saponins were not used to develop the model. They were external to the model. To establish the model, multiple linear regression (MLR) methodology with backward elimination of variables was applied. This procedure was aimed at reducing the differences between the actual and estimated logBB values. The

established QSAR model examines the quantitative relationship between the structure of a molecule and its ability to cross the BBB, expressed as logBB. In other words, various physicochemical parameters were determined to correlate specific properties of a molecule with its ability to cross the BBB (Table S2). Many attempts were made to obtain the best fit between the logBB values and the physicochemical properties of molecules. Each time analysis of variance was made. This was based on the following parameters: the determination coefficient (R²), predicted residual sum of squares (PRESS), root-mean-square error (RMSE), and root-mean-square error of leave-ten-out cross-validation (RMSECV). The leave-ten-out (LTO) cross-validation procedure was used to assess the predictive potency of the model. Then, to evaluate the reliability of the model, analysis of variance was made and the applicability domain (AD) was applied [90].

To calculate the logBB values for the tested saponins, the QSAR model previously obtained was used [90]. In this QSAR predictive model the BBB penetration potential was correlated with the lipophilic properties (logPow), excess molar refraction (E), the difference between the logarithms of n-octanol/water and cyclohexane/water partition coefficients values (Δ logP) being the hydrogen-bonding potential:

$$logBB = -0.114 - 0.098 \Delta logP + 0.278 logPow + 0.218E$$
 (2)

In the above equation, n = 40, $R^2_{CV} = 78.25\%$, $R^2_{pred} = 74.02\%$, and S = 0.436.

2.2. BBB Descriptors Calculated In Silico

Platycodin D

The values of the most important BBB pharmacokinetic descriptors of the brain were determined using the ACD/Percepta software, i.e., logBB, the distribution of a substance in the blood-brain area (the BBB penetration descriptor); logPS, the rate of passive diffusion/permeability (the permeability-surface area product); logPS_{Fubrain}, the brain/plasma equilibration rate; Fu, the fraction unbound in plasma; and Fb, the fraction unbound in brain (Table 3).

Name	logBB	logPS	logPS _{Fubrain}	Fu	Fb
Arjunic acid	0.14	-3.2	-4.9	0.012	0.02
Akebia saponin D	0.32	-4.4	-5.7	0.12	0.06
Bacoside A	0.03	-3.6	-4.5	0.14	0.13

Table 3. The pharmacokinetic BBB descriptors calculated in silico (ACD/Percepta).

< -2

logBB, Blood–brain barrier penetration descriptor; logPS, Logarithmic permeability–surface areaproduct; log(PS_{Fubrain}), Brain/plasma equilibration rate; Fu, Fraction unbound in plasma; Fb, Fraction unbound in the brain.

-9.0

0.52

-3.6

In a further part of the in silico studies, other significant physicochemical values were calculated in a similar way. According to the Hansch approach [58,92], steric, electronic and lipophilic parameters of the molecules were determined. The steric parameters describe the geometry of the molecule and, in particular, the overall size and shape of the molecule, demonstrating the potential fit of a compound to its cellular target. Among the steric parameters, the molar volume and molecular weight (MW) of the tested saponins were determined. The lipophilic parameters—crucial from the point of view of the undertaken scientific activity—describe the ability of a compound to penetrate the biological membranes (including the BBB) and thus characterize the transport and resorptive properties of a compound. The following logarithms of partition coefficients were determined: n-octanol/water (logPow), heptane/water (logPhw) and cyclohexane/water (logPcw).

Moreover, the excess molar refraction (E) was determined in silico based on the linear free energy relationship (LFER) methodology originally employed by Abraham [93,94]. It is commonly known that the LFER theory has been successfully used to characterize various biological and physicochemical processes, including permeability of a substance

through biological membranes. As shown in the previous paper [90], the excess molar refraction taken from the LFER approach, combined with the lipophilic descriptor logPow and the hydrogen-bonding parameter Δ logP, provide a promising combination to estimate the logBB values of triterpenoid saponins. In addition, other important physicochemical parameters have been calculated in silico (ACD/Percepta software), i.e., the topological polar surface area (TPSA), and polarizability, which can also determine the ability of the molecule to cross biological barriers, including the BBB [95]. Some of these parameters are presented in Table 4.

Name	LogPow (Octanol/Water)	logPhw (Heptane/Hater)	logPcw (Cyclohexane /Water)	Molecular Weight (MW) (g/mol)	Topological Polar Surface Area (TPSA) (Ų)	Polarizability
Arjunic acid	5.2	4.179	4.029	488.70	97.99	54.15
Akebia saponin D	0.8	-9.919	-9.932	929.10	294.98	91.23
Bacoside A	2.8	-7.553	-7.110	768.97	215.83	78.66
Platycodin D	-3.7	-24.512	-24.704	1225.32	453.28	114.32

Table 4. The chosen physicochemical parameters determined for the tested saponins.

2.3. Chromatographic Biomimetic Studies

Chromatographic biomimetic methods, including IAM, BMC, and CHOL, were used to determine BBB permeability of the tested triterpenoid saponins. For this purpose, the values of logkw, being the logarithm of retention factor extrapolated to pure water, were determined. These values were compared with the logBB values calculated in silico and those obtained using the QSAR model (Equation (2)). Logkw is recognized to be an alternative to the logPow lipophilicity descriptor [96]. On the other hand, lipophilicity is one of the most important features influencing the ability of substances to cross biological barriers [58].

Moreover, for the micellar biomimetic studies (BMC), Foley's equation [97] (Equation (3)) was used to calculate important physicochemical parameters, i.e., the analyte–micelle association constant (K_{MA}) and the partition coefficient of the analyte between the stationary phase and water (Psw). These parameters can describe possible interactions in the micellar system since the Brij35 micelle can be treated as a simple model of a biological barrier.

$$\frac{1}{k} = \frac{K_{MA}}{P_{SW}\Phi}C_M + \frac{1}{P_{SW}\Phi}$$
 (3)

where k is the retention factor, C_M is the concentration of micelles, K_{MA} is the analytemicelle association constant, P_{SW} is the partition coefficient of the analyte between the stationary phase and water, and Φ is the volume ratio of the stationary phase to the mobile phase volume.

In the research the following thesis was put forward for the first time: the logarithm of the analyte–micelle association constant ($\log K_{MA}$) values obtained from the bio-partitioning micellar systems corresponds to the logBB values. Thus, this indicates that the logBB values can be pre-estimated based only on the BMC retention data. Log K_{MA} can be a useful tool for rapid assessment of the ability of a substance to cross the BBB, especially in the early stage of research. The obtained results seem to confirm this thesis.

The obtained values of logarithm of retention factor extrapolated to pure water by means of the BMC, IAM, and CHOL methods (logkw-BMC, logkw-IAM, logkw-CHOL, respectively) are presented in Figure 1.

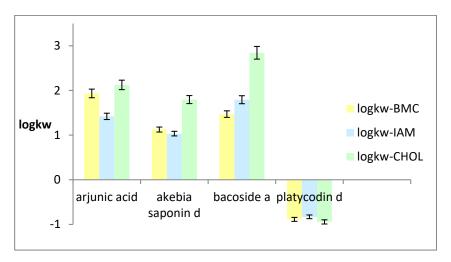


Figure 1. Logkw-BMC, logkw-IAM, and logkw-CHOL values obtained from the tested systems.

As mentioned above the logkw parameter, obtained from the biomimetic chromatographic systems, is recognized to be an alternative to the logarithm of the n-octanol/water partition coefficient (logPow) lipophilicity descriptor. Therefore, logkw-BMC, logkw-IAM, and logkw-CHOL values were used for the calculation of logBB based on the QSAR equation (Equation (2)), instead of the logPow parameter. The values of logBB-BMC, logBB-IAM, and logBB-CHOL were thus calculated. In Figure 2 the above-mentioned logBB values and logBB in silico calculated using the ACD/Percepta software, as well as those of log K_{MA} that can be treated as an equivalent to the logBB parameter, are presented.

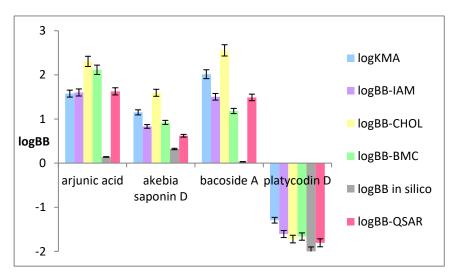


Figure 2. LogBB values obtained using the biomimetic and computational methods.

3. Discussion

The plant derived secondary metabolites including triterpenoid saponins have proved to be interesting sources of compounds with neuroprotective properties e.g., onjisaponins isolated from the roots of *Polygala tenuifolia* [98], platycodins from *Platycodi* radix [99] or medicagosides A-F from *Medicago sativa* L. [100]. Many saponins demonstrate therapeutic efficacy. In most cases they can cross the blood–brain barrier and can affect the central nervous system (CNS) including nerve cells of the brain and spinal cord which tend to maintain many direct body functions. They can also affect the autonomic nervous system which, in turn, is responsible for regulating, among others, heartbeat, blood circulation and breathing.

In the investigations, it was observed that the time to reach brain equilibrium can be prolonged when the BBB permeability–surface area product (PS) or the fraction unbound

in the brain (Fb) decreases [101]. However, this time value did not change when the brain/plasma equilibration rate (PS_{Fubrain}) was kept constant or when PS decreased and Fb increased simultaneously. Therefore, the compounds having similar PS_{Fubrain} values should exhibit comparable time to reach brain equilibrium, although they may have a much different PS value. In the experiment, three of the four substances, i.e., arjunic acid, akebia saponin D, and bacoside A exhibit similar logPS_{Fubrain} values (the average logPS_{Fubrain}: -5.03), whereas the logPS_{Fubrain} value for platycodin D is -9.0. Moreover, platycodin D also shows the highest value of the unbound fraction in the brain among the examined compounds (0.98).

Based on the obtained values of pharmacokinetic BBB parameters it can be concluded that among the tested compounds, only platycodin D is probably not permeable through the BBB (logBB from -2 to -1.29), even though the in silico estimated value of the fraction unbound in plasma is relatively high (0.52).

Nevertheless, there are reports in the literature [102] where it is assumed that platycodin D can permeate the BBB. However, the authors did not investigate the BBB permeability of this compound directly but based their assumption on the results of the studies of three other compounds capable of penetrating the BBB, i.e., saikosaponin A, glycyrrhizin, and ginsenoside. These compounds could attenuate neuroinflammation in the brain and have the ability to penetrate the blood-brain barrier [103]. There are also significant differences between the physicochemical parameters of platycodin D and the above-mentioned compounds, especially those steric (MW) and lipophilic (logPow) ones. For comparison, the molecular weights (MW) for saikosaponin A, glycyrrhizin, and ginsenoside are as follows: 781, 822.9, 785 g/mol, respectively, and MW for platycodin D is 1225.32 g/mol, whereas logPow values are equal to: 2.5, 3.7, 4, respectively, and for platycodin D, -3.7. As one can see, platycodin D has a much larger molecule, and, above all, it is a hydrophilic compound, unlike the above-mentioned substances. These characteristics significantly condition the permeation of compounds through biological barriers. Due to the specificity of the blood-brain barrier, only molecules with higher lipophilicity and lower molecular weight can enter the membrane easily [104].

Nevertheless, the research proves that platycodin D has a definite effect on the CNS, e.g., it protects the hippocampal CA1 region pyramidal neurons from an ischemic damage, blocks the activation of glial cells, and significantly reduces the neuroinflammation induced by ischemia/reperfusion in the hippocampal CA1 region [105]. Moreover, it has been proved that platycodin D could improve ethanol-induced memory impairment in mice [106].

Based on the studies presented in this paper, it is largely probable that the other three saponins, i.e., arjunic acid, akebia saponin D, and bacoside A, can penetrate the BBB. For these substances a similar brain-plasma equilibration rate was obtained (logPS; the average: -3.73). There are several scientific reports in the literature that confirm the ability of the saponins to cross the BBB. To study the neuroprotective effect of saponins occurring in the *Terminalia chebula* Retz, arjunic acid among others, the brain tissues of rats were analysed after the intragastric administration of the extract. The absorbed components in the rat plasma and brain were detected and analyzed using ultra-performance liquid chromatography—quadrupole time-of-flight mass spectrometry (UPLC—QTOF-MS) [107]. The postmortem studies of brain tissues showed that arjunic acid is present in rat brain tissues. Therefore, this confirms the ability of arjunic acid to cross the BBB.

Pro-cognitive properties of akebia saponin D were analyzed using in vivo behavioral tests on rats. Emotional disturbances and impairment i.e., anxiety, depression, or memory deficits, were induced by the intracerebroventricular injection of amyloid β -peptide (A β 25-35) into the lateral ventricles to simulate the symptoms of Alzheimer's disease (AD) [108]. In the paper it was concluded that akebia saponin D could significantly ameliorate the memory deficits and anxiety symptoms. Therefore, it might exert a significant neuroprotective effect on cognitive impairment.

The other studies also proved that akebia saponin D can be a desirable agent to protect against both Alzheimer's disease-related neuroinflammation and cognitive, including memory, impairment [109]. The protective effect of akebia saponin D was investigated in vivo in rats by bilateral intracerebroventricular injections of amyloid β peptide (A β 1–42) to induce memory impairment. Moreover, the anti-inflammatory and neuroprotective properties were studied using histochemistry and biochemistry methods.

The dammarane-type triterpenoid saponins identified in *Bacopa monnieri* (L.), including bacoside A also have neuroprotective and memory enhancing properties [110].

There are several in vitro and in vivo studies on the pharmacological properties of *Bacopa monnieri* which highlighted its neuroprotective properties. These abilities are mainly due to its antioxidative, antiapoptotic and anti-inflammatory potential. As shown by the results of the in vivo studies, the extract containing bacopasaponins could mitigate memory impairment and the degeneration of neurons in the hippocampus [111].

Unfortunately, very few systematic structure–activity relationship studies on the mechanism of neuroprotection shown by the triterpenoid saponins have been carried out [112]. Quantitative Structure–Activity Relationship (QSAR) studies are used for investigating the dependence between the structure of a substance and its biological activity. Contemporary drug design, toxicology and environmental monitoring often use the QSAR methodology. One of the main assumptions of QSAR studies is to view biological activity as a sum of the different interactions that a compound undergoes in the reaction with the sites of action (receptors), as well as during transport through biological membranes [113]. Various QSAR models for estimation of the ability of compounds to cross the blood–brain barrier were previously established. Most were based on the steric, electronic and lipophilic properties of the molecules [71,90,114–122] as well as on the LFER approach [43].

Studies on the structure–bioactivity relationships, in this case combining the ability of triterpenoid saponins to cross the BBB with their physicochemical parameters, are of significant importance. Therefore, they were intended to bridge a gap in this regard. For this purpose, the analysis of physicochemical parameters, including steric, lipophilic and electronic ones, was made. Taking into account the important physicochemical parameters (Table 4) and the above-mentioned QSAR model (Equation (2)), which proved to be effective in the case of the previously tested saponins [90], the logBB values were determined.

The analysis of the physicochemical parameters, among others, was based on the Hansch approach [58,92] and the Lipinski "rule of five" [95]. The analysis of the obtained values shows that the most lipophilic compound is arjunic acid, and the least is platycodin D. Moreover, platycodin D has the largest molecule (MW = 1225.32 g/mol) and is the most polarizable, in contrast to arjunic acid. Among the tested compounds, arjunic acid has the smallest topological polar surface area value (TPSA = 97.99Ų). A TPSA is commonly used in medicinal chemistry for the optimization of compound ability to cross biological membranes. To penetrate the BBB (and thus act on receptors in the CNS), a TPSA should be less than 90 Ų [123]. However, in order to cross any biological barriers, the size of a molecule and its lipophilicity are of crucial importance [58,92]. The analysis of the obtained values shows that arjunic acid is the most lipophilic and has the smallest molecular weight. Therefore, it is largely probable that, among the tested saponins, arjunic acid will cross the blood–brain barrier in the most effective way.

It is commonly known that both computational and biomimetic studies are of enormous significance, particularly in the early stages in the drug discovery process. These methods allow the characterization of already known as well as newly discovered compounds and to predict animal behaviour in the in vivo tests [64,124,125]. However, there are no scientific reports on the triterpenoid saponins' permeability studies through the BBB using biomimetic chromatographic methods.

As far as is known, this is the first paper on the applicability of the biomimetic chromatographic methods in predicting the penetration of triterpenoid saponins through any biological barriers. In this case, the tested barrier was the blood–brain.

In the stage of biomimetic chromatographic studies there the following methods were applied: High Performance Liquid Chromatography (HPLC) with Immobilized Artificial Membrane (IAM) and cholesterol (CHOL) stationary phases, as well as Bio-partitioning Micellar Chromatography (BMC). All these methods are commonly used to determine permeation of a substance through biological barriers (see Table 1).

The chromatographic biomimetic stationary phases, i.e., IAM and CHOL are considered to be the best chromatographic models used to assess the permeation capacity of substances through specific biological barriers. Solute partitioning between two phases is a well-known phenomenon in which these phases can be two fluid ones (organic/aqueous solvent mixtures), or a suspension of particles in the solute partitions between the continuous phase of the solvent and the surface of the particles [126]. The membrane partition coefficient is defined as the partition coefficient between membrane suspensions and an aqueous phase. Since the membrane partition coefficient correlates with permeability of a substance through biological barriers, it can provide critical insight into the solute–membrane interactions [126]. Unfortunately, it is difficult to measure the membrane partition coefficient in vivo. However, the retention factors (k) obtained using the systems imitating cell membrane (IAM, CHOL, BMC) are directly proportional to the partition coefficients of a solute on the given stationary phase. Therefore, the partition coefficients of analyte between the stationary phase and water can give us some information about ability of a substance to cross specific biological barriers [126].

Based on the obtained IAM and CHOL results, excellent linear relationships between the logarithms of retention factors (logk) and the percentage of organic modifier (acetonitrile) in the mobile phases were found over the whole eluent composition range studied, with correlation coefficient R^2 equal to 0.982 and 0.991, respectively. For the tested BMC system, the relationships between logk and the micellized surfactant concentration, C_M, expressed as: $C_M = C - CMC$, where C is the total surfactant concentration, and CMC is the critical micelle concentration, were also obtained with great linearity (R² 0.898). The obtained retention factors were then extrapolated to pure water by extrapolating to the zero acetonitrile concentration in the mobile phases (IAM, CHOL) and to the zero surfactant concentration in the BMC systems. Figure 1 shows that there are no great differences between the obtained logkw values. It is noteworthy that among the lipophilic compounds, i.e., arjunic acid, akebia saponin D, and bacoside A, the highest logkw values were obtained using the CHOL stationary phase. Assuming that the logkw parameter is alternative to the logPow lipophilicity descriptor, it can be noticed that the obtained logkw-CHOL values are mostly similar to the logPow values calculated in silico. In the case of platycodin D, the differences in the logkw values are negligible. This confirms that all three chromatographic methods, i.e., HPLC with both the immobilized artificial membrane and the cholesterol immobilized on silica gel, as well as the bio-partitioning micellar chromatography, described the BBB-permeation potential of triterpenoid saponins in a similar way.

In Figure 2 it can be observed that similar logBB values were obtained for hydrophilic platycodin D applying both the biomimetic and computational methods. The smallest difference in logBB values obtained using biomimetic and computational studies is observed between the logBB-CHOL and logBB-QSAR values (the absolute error is equal to 0.085) whereas the greatest difference is observed between logBB-IAM value and those obtained in silico (the absolute error is 0.393). The greatest differences are those obtained between the logBB values calculated using the biomimetic methods and those in silico in the case of lipophilic compounds. Significant differences are noticeable especially in the case of bacoside A between logBB-CHOL value and those obtained in silico (the absolute error is equal to 2.52). One of the possible explanations is that the computational studies do not take into account the interactions of a compound with a biological membrane that are possible in the cellular environment, e.g., electrostatic interactions [127]. The IAM and CHOL systems used here offer polar heads as the first contact site for solutes whereas the BMC allows the analysis of interactions in a micellar system, for example based on

Foley's equation (Equation (3)) [97], where the interactions in the micellar systems have been characterized.

Knowledge of the type of interaction between the analyte and the micelle, which in this case is a model of the blood-brain barrier, can provide valuable information on the mechanism of interactions between a substance and a barrier. For this purpose, important physicochemical parameters such as the $K_{\rm MA}$, the analyte-micelle association constant, and $P_{\rm SW}$, the partition coefficient of the analyte between the stationary phase and water, have been calculated. Based on the above–mentioned parameters, one can determine the strength of analyte interactions with the biological membrane. In these studies, it was indicated for the first time that the logarithm of the analyte–micelle association constant (log $K_{\rm MA}$) can characterize the passage of substances through the blood–brain barrier expressed by logBB. In other words, the log $K_{\rm MA}$ parameter can be treated as an equivalent to the logBB. Moreover, as shown in Figure 2 the previously established QSAR model also in this case confirmed its applicability and predictability in assessing the ability of triterpenoid saponins to penetrate the BBB.

4. Materials and Methods

4.1. Chemicals

The analytical standards of arjunic acid, akebia saponin D, bacoside A, and platy-codin D were purchased from Sigma Aldich (Sigma Aldrich, St. Louis, MO, USA; p.a.). Acetonitrile, isopropanol and poly-oxyethylene (23) lauryl ether (Brij35) were purchased from Merck (Darmstadt, Germany; p.a.). Citric acid and disodium hydrogen phosphate (Na₂HPO₄) were purchased from Sigma Aldich (Sigma Aldrich, St. Louis, MO, USA; p.a.). Distilled water was obtained from the Direct-Q3 UV apparatus (Millipore, Burlington, MA, USA).

4.2. Instrumentation

The Shimadzu Vp liquid chromatographic system (Shimadzu, Kyoto, Japan) equipped with LC 10AT pump, SPD 10A UV-Vis detector, SCL 10A system controller, CTO-10 AS chromatographic oven and Rheodyne injector valve with a 20 μ L loop was applied in the HPLC measurements.

4.3. Chromatographic Conditions

The solutions of analytical standards of the studied triterpenoid saponins were prepared in methanol (Merck, Darmstadt, Germany; p.a.) at a concentration of 1 mg/mL. All the compounds proved to be in the neutral form in solution under the experimental conditions. In the research each system was optimized previously. In the IAM and CHOL studies, acetonitrile-phosphate buffer solutions (0.3; 0.4; 0.5; 0.6 v/v; pH 7.4) were used as mobile phases. In the case of BMC analysis, the buffered solution of Brij35 (0.075; 0.1; 0.125; 0.15 mol/dm³; pH 7.4) was used as the mobile phase with the addition of isopropanol as an organic modifier (7% v/v). The buffer was prepared from the solutions of Na2HPO4 and citric acid (0.01 mol/dm³) and the pH 7.4 value was fixed before the preparation of the mobile phases.

The following stationary phases were employed: IAM.PC.DD2 100 \times 4.6 mm i.d., 10 µm (Regis Chemicals Company, Morton Grove, IL, USA); Cosmosil Cholester, 75 \times 2 mm i.d., 2.5 µm (Genore, Warsaw, Poland); Purosphere RP-18e (ODS), 125 \times 4 mm i.d., 5 µm (Merck, Darmstadt, Germany). The flow rates were established as follows: 1.3 mL/min (IAM), 0.4 mL/min (CHOL), and 1 mL/min (BMC). The tested saponins were detected with UV light at 254 nm. All measurements were made at 25 °C. The dead time values were measured from the non-retained compound (citric acid) peaks. All reported logkw values are the average of at least three independent measurements. The values of peak asymmetry factor were in the acceptable range.

4.4. Computer Programs

Within the in silico studies the ACD/Percepta software (version 2012, Advanced Chemistry Development, Inc., Toronto, ON, Canada) was used. Statistical analysis of the obtained results was made using the Minitab 18 Statistical Software (Minitab Inc., State College, PA, USA).

5. Conclusions

The main aim of the study was to evaluate the ability of naturally occurring triterpenoid saponins to cross the blood–brain barrier using both computational analysis including QSAR methodology and biomimetic studies using adequate liquid chromatographic techniques. To my knowledge, there are no scientific reports on triterpenoid saponins permeability studies through the BBB using the biomimetic chromatographic methods.

In these studies, it was indicated for the first time that the logarithm of the analyte—micelle association constant ($\log K_{MA}$) can characterize the passage of substances through the blood–brain barrier expressed as logBB. Comparing the biomimetic-logBB with the $\log K_{MA}$ values obtained using the BMC studies, it can be concluded that these values are comparable with each other. The analyte–micelle association constant is therefore a good descriptor of the ability of triterpenoid saponins to cross the BBB. The applied BMC system adequately reflects the cellular environment and can be successfully used to assess the penetration of substances through the blood–brain barrier. Based on the studies presented in this paper, it is largely probable that three of the four tested saponins, i.e., arjunic acid, akebia saponin D, and bacoside A can penetrate the BBB in contrast to platycodin D which does not cross this barrier. Moreover, the analysis of the obtained values shows that arjunic acid is the most lipophilic and has the smallest molecular weight. Therefore, it is largely probable that, among the tested saponins, arjunic acid will cross the BBB in the most effective way.

The research presented in the paper was also aimed at finding out which physicochemical parameters of the molecule are responsible for the molecule's ability to cross the blood–brain barrier. Therefore, structure–bioactivity relationships studies were carried out. The influence of specific physicochemical parameters on the ability of the triterpenoid saponins to cross the BBB was investigated. The applicability and predictability of the previously established QSAR model based on logPow, Δ logP, and E were then confirmed.

The presented research has proved that both the computational and biomimetic tests can be a useful screening tool for assessing the ability of a molecule to cross the specific biological barriers. Due to the ability of the above-mentioned substances to cross the blood–brain barrier, it can be assumed that these substances can be the subject of further research on their supposed neuroprotective properties.

Supplementary Materials: The following are available online at https://www.mdpi.com/article/10 .3390/ijms22073573/s1, Table S1: Experimentally obtained logBB [91] values for the compounds used as the training and test sets in the QSAR studies; Table S2: The LFER and chosen physicochemical parameters, calculated for the entire set of the tested compounds (ACD/Percepta).

Funding: The manuscript was supported by the National Science Centre (Poland)—project number: 2018/02/X/ST4/03450.

Conflicts of Interest: The authors declare no conflict of interest.

References

- 1. WHO. Dementia: A Public Health Priority; World Health Organization and Alzheimer's Disease International Report; WHO: Geneva, Switzerland, 2012.
- Tao, L.; Zhang, P.; Qin, C.; Chen, S.Y.; Zhang, C.; Chen, Z.; Zhu, F.; Yang, S.Y.; We, Y.Q.; Chen, Y.Z. Recent progresses in the exploration of machine learning methods as in-silico ADME prediction tools. *Adv. Drug Deliv. Rev.* 2015, 86, 83–100. [CrossRef] [PubMed]
- 3. Etkins, S.; Waller, C.L.; Swaan, P.W.; Cruciani, G.; Wrighton, S.A.; Wikel, J.H. Progress in predicting human ADME parameters in silico. *J. Pharmacol. Toxicol. Methods* **2000**, *44*, 251–272. [CrossRef]

4. Etkins, S.; Ring, B.J.; Grace, J.; McRobie-Belle, D.J.; Wrighton, S.A. Present and future in vitro approaches for drug metabolism. *J. Pharmacol. Toxicol. Methods* **2000**, *44*, 313–324. [CrossRef]

- 5. Drews, J. Drug discovery: A historical perspective. Science 2000, 287, 1960–1964. [CrossRef] [PubMed]
- 6. Van de Waterbeemd, H.; Gifford, E. ADMET in silico modelling: Towards prediction paradise? *Nat. Rev. Drug Discov.* **2003**, 2, 192–204. [CrossRef] [PubMed]
- 7. Stepensky, D. Prediction of drug disposition on the basis of its chemical structure. *Clin. Pharmacokinet.* **2013**, *52*, 415–431. [CrossRef]
- 8. Iyer, M.; Mishra, R.; Han, Y.; Hopfinger, A.J. Predicting Blood–Brain Barrier Partitioning of Organic Molecules Using Membrane-Interaction QSAR Analysis. *Pharm. Res.* **2002**, *19*, 1611–1621. [CrossRef]
- 9. Hou, T.J.; Xu, X.J. ADME evaluation in drug discovery 1. Applications of genetic algorithms to the prediction of blood–brain partitioning of a large set of drugs. *J. Mol. Model.* **2002**, *8*, 337–349. [CrossRef]
- 10. Hou, T.; Wang, J.; Zhang, W.; Wang, W.; Xu, X. Recent advances in computational prediction of drug absorption and permeability in drug discovery. *Curr. Med. Chem.* **2006**, *13*, 2653–2667. [CrossRef] [PubMed]
- 11. Worth, A.P.; Bassan, A.; Gallegos, A.; Netzeva, T.I.; Patlewicz, G.; Pavan, M.; Tsakovska, I.; Vracko, M. *The Characterisation of (Quantitative) Structure-Activity Relationships: Preliminary Guidance*; JRC Report EUR 21866 EN; European Chemicals Bureau: Ispra, Italy, 2005.
- 12. Zhou, Y.Q.; Yang, Z.L.; Xu, L.; Li, P.; Hu, Y.Z. Akebia saponin D, a saponin component from *Dipsacus asper* Wall, protects PC 12 cells against amyloid-beta induced cytotoxicity. *Cell Biol. Int.* **2009**, 33, 1102–1110. [CrossRef]
- 13. Ramasamy, S.; Chin, S.P.; Sukumaran, S.D.; Buckle, M.J.C.; Kiew, L.V.; Chung, L.Y. In Silico and In Vitro Analysis of Bacoside A Aglycones and Its Derivatives as the Constituents Responsible for the Cognitive Effects of *Bacopa monnieri*. *PLoS ONE* **2015**, *10*, e0126565. [CrossRef] [PubMed]
- Madhu, K.; Prakash, T.; Maya, S. Bacoside-A inhibits inflammatory cytokines and chemokine in experimental autoimmune encephalomyelitis. *Biomed. Pharmacother.* 2019, 109, 1339–1345. [CrossRef]
- 15. Wang, G.; Guo, H.; Wang, X. Platycodin D protects cortical neurons against oxygen-glucose deprivation/reperfusion in neonatal hypoxic-ischemic encephalopathy. *J. Cell. Biochem.* **2019**, 120, 14028–14034. [CrossRef]
- Thomas, R.B.; Joy, S.; Ajayan, M.S.; Paulose, C.S. Neuroprotective potential of Bacopa monnieri and Bacoside A against dopamine receptor dysfunction in the cerebral cortex of neonatal hypoglycaemic rats. Cell. Mol. Neurobiol. 2013, 33, 1065–1074. [CrossRef]
- 17. Dubey, T.; Chinnathambi, S. Brahmi (*Bacopa monnieri*): An ayurvedic herb against the Alzheimer's disease. *Arch. Biochem. Biophys.* **2019**, *676*, 108153. [CrossRef] [PubMed]
- 18. Sekhar, V.C.; Viswanathan, G.; Baby, S. Insights Into the Molecular Aspects of Neuroprotective Bacoside A and Bacopaside I. *Curr. Neuropharmacol.* **2019**, *17*, 438–446. [CrossRef]
- 19. Gupta, D.; Kumar, M. Evaluation of in vitro antimicrobial potential and GC-MS analysis of *Camellia sinensis* and *Terminalia arjuna*. *Biotechnol. Rep.* **2016**, *13*, 19–25. [CrossRef] [PubMed]
- 20. Mandal, S.; Patra, A.; Samanta, A.; Roy, S.; Mandal, A.; Mahapatra, T.D.; Pradhan, S.; Das, K.; Nandi, D.K. Analysis of phytochemical profile of *Terminalia arjuna* bark extract with antioxidative and antimicrobial properties. *Asian Pac. J. Trop. Biomed.* 2013, 12, 960–966. [CrossRef]
- 21. Dube, N.; Nimgulkar, C.; Bharatraj, D.K. Validation of therapeutic anti-inflammatory potential of Arjuna Ksheera Paka—A traditional Ayurvedic formulation of *Terminalia arjuna*. *J. Tradit. Complementary Med.* **2017**, 7, 414–420. [CrossRef] [PubMed]
- 22. Ahmad, M.S.; Ahmad, S.; Gautam, B.; Arshad, M.; Afzal, M. Terminalia arjuna, a herbal remedy against environmental carcinogenicity: An in vitro and in vivo study. *Egypt J. Med. Hum. Genet.* **2014**, *15*, 61–67. [CrossRef]
- 23. Pugazhendhi, A.; Shafreen, R.B.; Devi, K.P.; Suganthy, N. Assessment of antioxidant, anticholinesterase and antiamyloidogenic effect of *Terminalia chebula*, *Terminalia arjuna* and its bioactive constituent 7-Methyl gallic acid—An in vitro and in silico studies. *J. Mol. Liq.* 2018, 257, 69–81. [CrossRef]
- 24. Yaidikar, L.; Thakur, S. Arjunolic acid, a pentacyclic triterpenoidal saponin of *Terminalia arjuna* bark protects neurons from oxidative stress associated damage in focal cerebral ischemia and reperfusion. *Pharmacol. Rep.* **2015**, *67*, 890–895. [CrossRef]
- 25. Mohanty, I.R.; Borde, M.; Kumar, C.S.; Maheshwari, U. Dipeptidyl peptidase IV Inhibitory activity of *Terminalia arjuna* attributes to its cardioprotective effects in experimental diabetes: In silico, in vitro and in vivo analyses. *Phytomedicine* **2019**, *57*, 158–165. [CrossRef]
- 26. Kapoor, D.; Vijayvergiya, R.; Dhawan, V. Terminalia arjuna in coronary artery disease: Ethnopharmacology, pre-clinical, clinical & safety evaluation. *J. Ethnopharmacol.* **2014**, *155*, 1029–1045. [CrossRef]
- 27. Bhattacharjee, B.; Pal, P.K.; Ghosh, A.K.; Mishra, S.; Chattopadhyay, A.; Bandyopadhyay, D. Aqueous bark extract of *Terminalia arjuna* protects against cadmium-induced hepatic and cardiac injuries in male Wistar rats through antioxidative mechanisms. *Food Chem. Toxicol.* **2019**, 124, 249–264. [CrossRef]
- 28. Daneman, R.; Prat, A. The blood-brain barrier. Cold Spring Harb. Perspect. Biol. 2015, 7, a020412. [CrossRef] [PubMed]
- 29. Delsing, L.; Herland, A.; Falk, A.; Hicks, R.; Synnergren, J.; Zetterberg, H. Models of the blood-brain barrier using iPSC-derived cells. *Mol. Cell. Neurosci.* **2020**, *107*, 103533. [CrossRef]
- 30. Ballabh, P.; Braun, A.; Nedergaard, M. The blood–brain barrier: An overview. Structure, regulation, and clinical implications. *Neurobiol. Dis.* **2004**, *16*, 1–13. [CrossRef] [PubMed]

31. Van Leeuwen, E.; Hampton, M.B.; Smyth, L.C.D. Redox signalling and regulation of the blood-brain barrier. *Int. J. Biochem. Cell Biol.* **2020**, 125, 105794. [CrossRef] [PubMed]

- 32. Pardridge, W.M. Blood-brain barrier biology and methodology. J. Neurovirol. 1999, 5, 556-569. [CrossRef] [PubMed]
- 33. Cereijido, M.; Ruiz, O.; González-Mariscal, L.; Contreras, R.; Susana Balda, M.; García-Villegas, M.R. The Paracellular Pathway. In *Biological Barriers to Protein Delivery. Pharmaceutical Biotechnology*; Audus, K.L., Raub, T.J., Eds.; Springer: Boston, MA, USA, 1993; Volume 4. [CrossRef]
- 34. Laksitorini, M.; Prasasty, V.D.; Kiptoo, P.K.; Siahaan, T.J. Pathways and Progress in Improving Drug Delivery through the Intestinal Mucosa and Blood-Brain Barriers. *Ther. Deliv.* **2014**, *10*, 1143–1163. [CrossRef]
- 35. Abbott, N.J.; Ronnback, L.; Hansson, E. Astrocyte-endothelial interactions at the blood–brain barrier. *Nat. Rev. Neurosci.* **2006**, 7, 41–53. [CrossRef] [PubMed]
- 36. Cardoso, L.F.; Brites, D.; Brito, M.A. Looking at the blood–brain barrier: Molecular anatomy and possible investigation approaches. *Brain Res. Rev.* **2010**, *64*, 328–363. [CrossRef] [PubMed]
- 37. Chen, Y.; Liu, L. Modern methods for delivery of drugs across the blood–brain barrier. *Adv. Drug Deliv. Rev.* **2012**, *64*, 640–665. [CrossRef] [PubMed]
- 38. Zheng, W.; Aschner, M.; Ghersi-Egea, J.F. Brain barrier systems: A new frontier in metal neurotoxicological research. *Toxicol. Appl. Pharmacol.* **2003**, *192*, 1–11. [CrossRef]
- 39. Norsted, E.; Gomuc, B.; Meister, B. Protein components of the blood–brain barrier (BBB) in the mediobasal hypothalamus. *J. Chem. Neuroanat.* **2008**, *36*, 107–121. [CrossRef]
- 40. Sá-Pereira, I.; Brites, D.; Brito, M.A. Neurovascular unit: A focus on pericytes. *Mol. Neurobiol.* **2012**, *45*, 327–347. [CrossRef] [PubMed]
- 41. Nikolakopoulou, A.M.; Montagne, A.; Kisler, K.; Dai, Z.; Wang, Y.; Huuskonen, M.T.; Sagare, A.P.; Lazic, D.; Sweeney, M.D.; Kong, P.; et al. Pericyte loss leads to circulatory failure and pleiotrophin depletion causing neuron loss. *Nat. Neurosci.* **2019**, 22, 1089–1098. [CrossRef] [PubMed]
- 42. Bell, R.D.; Winkler, E.A.; Sagare, A.P.; Singh, I.; LaRue, B.; Deane, R.; Zlokovic, B.V. Pericytes control key neurovascular functions and neuronal phenotype in the adult brain and during brain aging. *Neuron* **2010**, *68*, 409–427. [CrossRef]
- 43. Platts, J.A.; Abraham, M.H.; Zhao, Y.H.; Hersey, A.; Ijaz, L.; Butina, D. Correlation and prediction of a large blood-brain distribution data set–an LFER study. *Eur. J. Med. Chem.* **2001**, *36*, 719–730. [CrossRef]
- 44. Pangalos, M.N.; Schechter, L.E.; Hurko, O. Drug development for CNS disorders: Strategies for balancing risk and reducing attrition. *Nat. Rev. Drug Discov.* **2007**, *6*, 521–532. [CrossRef]
- 45. Molero-Monfort, M.; Escuder-Gilabert, L.; Villanueva-Camanas, R.M.; Sagrado, S.; Medina-Hernández, M.J. Biopartitioning micellar chromatography: An in vitro technique for predicting human drug absorption. *J. Chromatogr. B* **2001**, 753, 225–236. [CrossRef]
- 46. Escuder-Gilabert, L.; Martinez-Pla, J.J.; Sagrado, S.; Villanueva-Camanas, R.M.; Medina-Hernández, M.J. Biopartitioning micellar separation methods: Modelling drug absorption, *J. Chromatogr. B* **2003**, 797, 21–35. [CrossRef]
- 47. Quiñones-Torrelo, C.; Martin-Biosca, Y.; Martínez-Pla, J.J.; Sagrado, S.; Villanueva-Camañas, R.M.; Medina-Hernández, M.J. QRAR models for central nervous system drugs using biopartitioning micellar chromatography. *Mini Rev. Med. Chem.* 2002, 2, 145–161. [CrossRef]
- 48. Escuder-Gilabert, L.; Sagrado, S.; Villanueva-Camañas, R.M.; Medina-Hernández, M.J. Quantitative Retention—Structure and Retention—Activity Relationship Studies of Local Anesthetics by Micellar Liquid Chromatography. *Anal. Chem.* **1998**, 70, 28–34. [CrossRef]
- 49. Escuder-Gilabert, L.; Sanchis-Mallols, J.M.; Sagrado, S.; Medina-Hernández, M.J.; Villanueva-Camañas, R.M. Chromatographic quantitation of the hydrophobicity of ionic compounds by the use of micellar mobile phases. *J. Chromatogr. A* **1998**, 823, 549–559. [CrossRef]
- 50. Quiñones-Torrelo, C.; Sagrado, S.; Villanueva-Camañas, R.M.; Medina-Hernández, M.J. Development of Predictive Retention—Activity Relationship Models of Tricyclic Antidepressants by Micellar Liquid Chromatography. *J. Med. Chem.* 1999, 42, 3154–3162. [CrossRef]
- 51. Martin-Biosca, Y.; Molero-Monfort, M.; Sagrado, S.; Villanueva-Camañas, R.M.; Medina-Hernández, M.J. Development of predictive retention–activity relationship models of antipsychotic drugs by micellar liquid chromatography. *Biomed. Chromatogr.* 1999, 13, 478–492. [CrossRef]
- 52. Escuder-Gilabert, L.; Sagrado, S.; Villanueva-Camañas, R.M.; Medina-Hernández, M.J. Development of predictive retention–activity relationship models of non-steroidal anti-inflammatory drugs by micellar liquid chromatography: Comparison with immobilized artificial membrane columns. *J. Chromatogr. B* **2000**, 740, 59–70. [CrossRef]
- 53. Martinez-Pla, J.J.; Sagrado, S.; Villanueva-Camañas, R.M.; Medina-Hernández, M.J. Retention–property relationships of anticonvulsant drugs by biopartitioning micellar chromatography. *J. Chromatogr. B* **2001**, 757, 89–99. [CrossRef]
- 54. Arunyanart, M.; Cline-Love, L. Model for micellar effects on liquid chromatography capacity factors and for determination of micelle-solute equilibrium constants. *Anal. Chem.* **1984**, *56*, 1557–1561. [CrossRef]
- 55. López-Grío, S.; Baeza-Baeza, J.J.; García-Alvarez-Coque, M.C. Influence of the addition of modifiers on solute-micelle interaction in hybrid micellar liquid chromatography. *Chromatographia* **1998**, *48*, 655–663. [CrossRef]

56. Medina-Hernández, M.J.; García-Álvarez-Coque, M.C. Solute-mobile phase and solute-stationary phase interactions in micellar liquid chromatography. A review. *Analyst* **1992**, *117*, 831–837. [CrossRef]

- 57. Berthod, A.; Girard, I.; Gonnet, G. Additive effects on surfactant adsorption and ionic solute retention in micellar liquid chromatography. *Anal. Chem.* **1986**, *58*, 1362–1367. [CrossRef]
- 58. Hansch, C. Quantitative approach to biochemical structure-activity relationships. Acc. Chem. Res. 1969, 2, 232–239. [CrossRef]
- 59. Liu, R.; Li, X.; Lam, K.S. Combinatorial Chemistry in Drug Discovery. Curr. Opin. Chem. Biol. 2017, 38, 117–126. [CrossRef]
- 60. Herrmann, A. Dynamic Combinatorial/Covalent Chemistry: A Tool to Read, Generate and Modulate the Bioactivity of Compounds and Compound Mixtures. *Chem. Soc. Rev.* **2014**, *43*, 1899–1933. [CrossRef] [PubMed]
- 61. Russo, G.; Grumetto, L.; Szucs, R.; Barbato, F.; Lynen, F. Screening therapeutics according to their uptake across the blood-brain barrier: A high throughput method based on immobilized artificial membrane liquid chromatography-diode-array-detection coupled to electrospray-time-of-flight mass spectrometry. *Eur. J. Pharm. Biopharm.* **2018**, 127, 72–84. [CrossRef]
- 62. Pidgeon, C.; Venkataram, U.V. Immobilized artificial membrane chromatography: Supports composed of membrane lipids. *Anal. Biochem.* **1989**, 176, 36–47. [CrossRef]
- 63. Janicka, M.; Sztanke, M.; Sztanke, K. Predicting the Blood-Brain Barrier Permeability of New Drug-Like Compounds via HPLC with Various Stationary Phases. *Molecules* **2020**, 25, 487. [CrossRef] [PubMed]
- 64. Tsopelas, F.; Malaki, N.; Vallianatou, T.; Chrysanthakopoulos, M.; Vrakas, D.; Ochsenkühn-Petropoulou, M.; Tsantili-Kakoulidou, A. Insight into the retention mechanism on immobilized artificial membrane chromatography using two stationary phases. *J. Chromatogr. A* 2015, 1396, 25–33. [CrossRef]
- 65. Stergiopoulos, C.; Makarouni, D.; Tsantili-Kakoulidou, A.; Ochsenkühn-Petropoulou, M.; Tsopelas, F. Immobilized artificial membrane chromatography as a tool for the prediction of ecotoxicity of pesticides. *Chemosphere* **2019**, 224, 128–139. [CrossRef]
- 66. Tsopelas, F.; Stergiopoulos, C.; Tsakanika, L.-A.; Ochsenkühn-Petropoulou, M.; Tsantili-Kakoulidou, A. The use of immobilized artificial membrane chromatography to predict bioconcentration of pharmaceutical compounds. *Ecotoxicol. Environ. Saf.* **2017**, 139, 150–157. [CrossRef] [PubMed]
- 67. Kotecha, J.; Shah, S.; Rathod, I.; Subbaiah, G. Relationship between immobilized artificial membrane chromatographic retention and human oral absorption of structurally diverse drugs. *Int. J. Pharm.* **2007**, *333*, 127–135. [CrossRef]
- 68. Barbato, F.; Cappello, B.; Miro, A.; La Rotonda, M.I.; Quaglia, F. Chromatographic indexes on immobilized artificial membranes for the prediction of transdermal transport of drugs. *Il Farmaco* **1998**, *53*, 655–661. [CrossRef]
- 69. Sui, X.; Sun, J.; Li, H.; Wang, Y.; Liu, J.; Liu, X.; Zhang, W.; Chen, L.; He, Z. Prediction of volume of distribution values in human using immobilized artificial membrane partitioning coefficients, the fraction of compound ionized and plasma protein binding data. *Eur. J. Med. Chem.* **2009**, *44*, 4455–4460. [CrossRef]
- 70. Valko, K.; Nunhuck, S.; Bevan, C.; Abraham, M.H.; Reynolds, D.P. Fast Gradient HPLC Method to Determine Compounds Binding to Human Serum Albumin. Relationships with Octanol/Water and Immobilized Artificial Membrane Lipophilicity. *J. Pharm. Sci.* 2003, 92, 2236–2248. [CrossRef] [PubMed]
- 71. Salminen, T.; Pulli, A.; Taskinen, J. Relationship between immobilised artificial membrane chromatographic retention and the brain penetration of structurally diverse drugs. *J. Pharm. Biomed. Anal.* **1997**, *15*, 469–477. [CrossRef]
- 72. Cuenca-Benito, M.; Sagrado, S.; Villanueva-Camañas, R.M.; Medina-Hernández, M.J. Quantitative retention–structure and retention–activity relationships of barbiturates by micellar liquid chromatography. *J. Chromatogr. A* 1998, 814, 121–132. [CrossRef]
- 73. Sanchis-Mallols, J.M.; Sagrado, S.; Villanueva-Camanas, R.M.; Medina-Hernandez, M.J. Quantitative retention—structure and retention—activity relationship studies of ionic and non-ionic catecholamines by micellar liquid chromatography. *Chromatographia* 1997, 46, 605–612. [CrossRef]
- 74. Molero-Monfort, M.; Sagrado, S.; Villanueva-Camañas, R.M.; Medina-Hernández, M.J. Retention–activity relationship studies of benzodiazepines by micellar liquid chromatography. *Biomed. Chromatogr.* **1999**, *13*, 394–400. [CrossRef]
- 75. Stępnik, K.; Malinowska, I.; Rój, E. In vitro and in silico determination of oral, jejunum and Caco-2 human absorption of fatty acids and polyphenols. Micellar liquid chromatography. *Talanta* **2014**, *130*, 265–273. [CrossRef] [PubMed]
- 76. Escuder-Gilabert, L.; Molero-Monfort, M.; Villanueva-Camañas, R.M.; Sagrado, S.; Medina-Hernández, M.J. Potential of biopartitioning micellar chromatography as an in vitro technique for predicting drug penetration across the blood–brain barrier. *J. Chromatogr. B* **2004**, 807, 193–201. [CrossRef]
- 77. Stepnik, K.; Malinowska, I. The use of biopartitioning micellar chromatography and immobilized artificial membrane column for in silico and in vitro determination of blood–brain barrier penetration of phenols. *J. Chromatogr. A* **2013**, *1286*, 127–136. [CrossRef]
- 78. Martínez-Pla, J.J.; Martín-Biosca, Y.; Sagrado, S.; Villanueva-Camanas, R.M.; Medina-Hernandez, M.J. Evaluation of the pH effect of formulations on the skin permeability of drugs by biopartitioning micellar chromatography. *J. Chromatogr. A* **2004**, 1047, 255–262. [CrossRef] [PubMed]
- 79. Stępnik, K.; Malinowska, I. Skin-mimetic chromatography for prediction of human percutaneous absorption of biologically active compounds occurring in medicinal plant extracts. *Biomed. Chromat.* **2017**, *31*, e3922. [CrossRef] [PubMed]
- 80. Hadjmohammadi, M.; Salary, M. Biopartitioning micellar chromatography with sodium dodecyl sulfate as a pseudo α_1 -acid glycoprotein to the prediction of protein–drug binding. *J. Chromatogr. B* **2013**, *912*, 50–55. [CrossRef] [PubMed]
- 81. Tsopelas, F.; Danias, P.; Pappa, A.; Tsantili-Kakoulidou, A. Biopartitioning micellar chromatography under different conditions: Insight into the retention mechanism and the potential to model biological processes. *J. Chromatogr. A* **2020**, *1621*, 461027. [CrossRef]

82. Dobričić, V.; Savić, J.; Nikolic, K.; Vladimirov, S.; Vujić, Z.; Brborić, J. Application of biopartitioning micellar chromatography and QSRR modeling for prediction of gastrointestinal absorption and design of novel β-hydroxy-β-arylalkanoic acids. *Eur. J. Pharm. Sci.* 2017, 100, 280–284. [CrossRef] [PubMed]

- 83. Martín-Biosca, Y.; Torres-Cartas, S.; Villanueva-Camanas, R.M.; Sagrado, S.; Medina-Hernández, M.J. Biopartitioning micellar chromatography to predict blood to lung, blood to liver, blood to fat and blood to skin partition coefficients of drugs. *Anal. Chim. Acta* 2009, 632, 296–303. [CrossRef]
- 84. Dobričić, V.; Nikolic, K.; Vladimirov, S.; Čudina, O. Biopartitioningmicellar chromatographyas a predictive tool for skin and corneal permeability of newly synthesized 17β-carboxamide steroids. *Eur.J. Pharm. Sci.* **2014**, *56*, 105–112. [CrossRef]
- 85. Martín-Biosca, Y.; Molero-Monfort, M.; Sagrado, S.; Villanueva-Camañas, R.M.; Medina-Hernández, M.J. Rapid in vitro test to predict ocular tissue permeability based on biopartitioning micellar chromatography. *Eur. J. Pharm. Sci.* **2003**, 20, 209–216. [CrossRef]
- 86. Lu, R.; Sun, J.; Wang, Y.; Li, H.; Liu, J.; Fang, L.; He, Z. Characterization of biopartitioning micellar chromatography system using monolithic column by linear solvation energy relationship and application to predict blood–brain barrier penetration. *J. Chromatogr. A* 2009, 1216, 5190–5198. [CrossRef]
- 87. Yin, C.; Ma, L.; Huang, J.; Xu, L.; Shi, Z. Fast profiling ecotoxicity and skin permeability of benzophenone ultraviolet filters using biopartitioning micellar chromatography based on penetrable silica spheres. *Anal. Chim. Acta* **2013**, *804*, 321–327. [CrossRef]
- 88. Li, J.; Sun, J.; He, Z. Quantitative structure–retention relationship studies with immobilized artificial membrane chromatography II: Partial least squares regression. *J. Chromatogr. A* **2007**, *1140*, 174–179. [CrossRef]
- 89. Janicka, M.; Sztanke, M.; Sztanke, K. Reversed-phase liquid chromatography with octadecylsilyl, immobilized artificial membrane and cholesterol columns in correlation studies with in silico biological descriptors of newly synthesized antiproliferative and analgesic active compounds. *J. Chromatogr. A* 2013, 1318, 92–101. [CrossRef] [PubMed]
- 90. Stępnik, K.; Kukula-Koch, W. In Silico Studies on Triterpenoid Saponins Permeation through the Blood–Brain Barrier Combined with Postmortem Research on the Brain Tissues of Mice Affected by Astragaloside IV Administration. *Int. J. Mol. Sci.* **2020**, *21*, 2534. [CrossRef] [PubMed]
- 91. Mente, S.R.; Lombardo, F. A recursive—Partitioning model for blood–brain barrier permeation. *J. Comput. Aided Mol. Des.* **2005**, 19, 465–481. [CrossRef]
- 92. Hansch, C.; Fujita, T. p-σ-π analysis. A Method for the correlation of biological activity and chemical structure. *J. Am. Chem. Soc.* **1964**, *86*, 1616–1626. [CrossRef]
- 93. Abraham, M.H.; Takács-Novák, K.; Mitchell, R.C. On the partition of ampholytes: Application to blood–braindistribution. *J. Pharm. Sci.* **1997**, *86*, 310–315. [CrossRef]
- 94. Abraham, M.H. The factors that influence permeation across the blood–brain barrier. *Eur. J. Med. Chem.* **2004**, *39*, 235–240. [CrossRef]
- 95. Lipinski, C.A.; Lombardo, F.; Dominy, B.W.; Feeney, P.J. Experimental and computational approaches to estimate solubility and permeability in drug discovery and development settings. *Adv. Drug Deliv. Rev.* **1997**, 23, 3–25. [CrossRef]
- 96. Jandera, P.; Fischer, J.; Effenberger, H. Characterisation of retention in micellar high-performance liquid chromatography and in micellar electrokinetic chromatography using lipophilicity and polarity indices. *J. Chromatogr. A* **1998**, *807*, 57–70. [CrossRef]
- 97. Foley, J.P. Critical compilation of solute-micelle binding constants and related parameters from micellar liquid chromatographic measurements. *Anal. Chim. Acta* **1990**, 23, 231–237. [CrossRef]
- 98. Li, C.; Yang, J.; Yu, S.; Chen, N.; Xue, W.; Hu, J.; Zhang, D. Triterpenoid Saponins with Neuroprotective Effects from the Roots of *Polygala tenuifolia*. *Planta Med*. **2008**, 74, 133–141. [CrossRef] [PubMed]
- 99. Son, I.H.; Park, Y.H.; Lee, S.I.; Yang, H.D.; Moon, H.-I. Neuroprotective Activity of Triterpenoid Saponins from *Platycodi radix* against Glutamate-induced Toxicity in Primary Cultured Rat Cortical Cells. *Molecules* **2007**, *12*, 1147–1152. [CrossRef]
- 100. Liu, X.-G.; Sun, Y.-Q.; Bian, J.; Han, T.; Yue, D.-D.; Li, D.-Q.; Gao, P.-Y. Neuroprotective effects of triterpenoid saponins from Medicago sativa L. against H2O2-induced oxidative stress in SH-SY5Y cells. *Bioorg. Chem.* **2019**, *83*, 468–476. [CrossRef]
- 101. Liu, X.; Smith, B.J.; Chen, C.; Callegari, E.; Becker, S.L.; Chen, X.; Cianfrogna, J.; Doran, A.C.; Doran, S.D.; Gibbs, J.P.; et al. Use of a physiologically based pharmacokinetic model to study the time to reach brain equilibrium: An experimental analysis of the role of blood–brain barrier permeability, plasma protein binding, and brain tissue binding. *Pharmacol. Exp. Ther.* **2005**, *313*, 1254–1262. [CrossRef] [PubMed]
- 102. Fu, Y.; Xin, Z.; Liu, B.; Wang, J.; Wang, J.; Zhang, X.; Wang, Y.; Li, F. Platycodin D Inhibits Inflammatory Response in LPS-Stimulated Primary Rat Microglia Cells through Activating LXRα–ABCA1 Signaling Pathway. *Front. Immunol.* **2018**, *8*, 1929. [CrossRef]
- 103. ElAli, A.; Hermann, D.M. Liver X receptor activation enhances blood-brain barrier integrity in the ischemic brain and increases the abundance of ATP-binding cassette transporters ABCB1 and ABCC1 on brain capillary cells. *Brain Pathol.* **2012**, 22, 175–187. [CrossRef]
- 104. Zuo, A.H.; Cheng, M.C.; Wang, L.; Xiao, H.B. Analysis of chemical constituents of Chuanxiong Rhizoma absorbed into rat brain tissues by UPLC-Q-TOF-MS. *China J. Chin. Mater. Med.* **2012**, *37*, 3647–3650.
- 105. Choi, J.H.; Yoo, K.-Y.; Park, O.K.; Lee, C.H.; Won, M.-H.; Hwang, I.K.; Ryu, S.Y.; Kim, Y.S.; Yi, J.-S.; Bae, Y.-S.; et al. Platycodin D and 2"-o-acetyl-polygalacin D2 isolated from *Platycodon grandiflorum* protect ischemia/reperfusion injury in the gerbil hippocampus. *Brain Res.* 2009, 1279, 197–208. [CrossRef] [PubMed]

106. Choi, Y.H.; Kim, Y.S.; Yeo, S.J.; Roh, S.H.; Jeong, Y.C.; Kang, J.S.; Ryu, S.Y. Ameliorating effect of balloon flower saponin on the ethanol-induced memory impairment in mice. *Phytother. Res.* **2008**, 22, 973–976. [CrossRef] [PubMed]

- 107. Zhang, Y.; Liu, X.; Gao, S.; Qian, K.; Liu, Q.; Yin, X. Research on the neuro-protective compounds in *Terminalia chebula* Retz extracts in-vivo by UPLC–QTOF-MS. *Acta Chromatogr.* **2018**, *30*, 169–174. [CrossRef]
- 108. Wang, Y.; Shen, J.; Yang, X.; Jin, Y.; Yang, Z.; Wang, R.; Zhang, F.; Linhardt, R.J. Akebia saponin D reverses corticosterone hypersecretion in an Alzheimer's disease rat model. *Biomed. Pharmacother.* **2018**, *107*, 219–225. [CrossRef]
- 109. Yu, X.; Wang, L.; Du, Q.; Ma, L.; Chen, L.; You, R.; Liu, L.; Ling, J.; Yang, Z.; Ji, H. Akebia Saponin D attenuates amyloid β-induced cognitive deficits and inflammatory response in rats: Involvement of Akt/NF-κB pathway. *Behav. Brain Res.* **2012**, 235, 200–209. [CrossRef]
- 110. Nandy, S.; Dey, A.; Mukherjeeb, A. Chapter 15—Advances in dammarane-type triterpenoid saponins from *Bacopa monnieri*: Structure, bioactivity, biotechnology and neuroprotection. In *Studies in Natural Products Chemistry*; Atta-ur-Rahman, Ed.; Elsevier: Amsterdam, The Netherlands, 2019; Volume 63, pp. 489–533.
- 111. Uabundit, N.; Wattanathorn, J.; Mucimapura, S.; Ingkaninan, K. Cognitive enhancement and neuroprotective effects of *Bacopamonnieri* in Alzheimer's disease model. *J. Ethnopharmacol.* **2010**, *127*, 26–31. [CrossRef] [PubMed]
- 112. Sukumaran, N.P.; Amalraj, A.; Gopi, S. Neuropharmacological and cognitive effects of *Bacopa monnieri* (L.) Wettst—A review on its mechanistic aspects. *Complementary Ther. Med.* **2019**, *44*, 68–82. [CrossRef]
- 113. Gozalbes, R.; Pineda-Lucena, A. QSAR-based solubility model for drug-like compounds. *Bioorg. Med. Chem.* **2010**, *18*, 7078–7084. [CrossRef]
- 114. Young, R.C.; Mitchell, R.C.; Brown, T.H.; Ganellin, C.R.; Griffiths, R.; Jones, M.; Rana, K.K.; Saunders, D.; Smith, I.R.; Sore, N.E.; et al. Development of a new physicochemical model for brain penetration and its application to the design of centrally acting H2receptor histamine antagonists. *J. Med. Chem.* 1988, 31, 656–671. [CrossRef]
- 115. Rose, K.; Hall, L.H.; Kier, L.B. Modeling Blood–Brain Barrier Partitioning Using the Electrotopological State. *J. Chem. Inf. Comput. Sci.* 2002, 42, 651–666. [CrossRef] [PubMed]
- 116. Lombardo, F.; Blake, J.F.; Curatolo, W.J. Computation of brain-blood partitioning of organic solutes via free energy calculations. *J. Med. Chem.* **1996**, *39*, 4750–4755. [CrossRef]
- 117. Kaliszan, R.; Markuszewski, M. Brain/blood distribution described by a combination of partition coefficient and molecular mass. *Int. J. Pharm.* **1996**, *145*, 9–16. [CrossRef]
- 118. Clark, D.E. Rapid calculation of polar molecular surface area and its application to the prediction of transport phenomena. 2. Prediction of blood-brain barrier penetration. *J. Pharm. Sci.* **1999**, *88*, 815–821. [CrossRef] [PubMed]
- 119. Feher, M.; Sourial, E.; Schmidt, J.M. A simple model for the prediction of blood brain partitioning. *Int. J. Pharm.* **2000**, 201, 239–247. [CrossRef]
- 120. Keseru, G.M.; Molnar, L. High-throughput prediction of blood-brain partitioning: A thermodynamic approach. *J. Chem. Inf. Comput. Sci.* **2001**, *41*, 120–128. [CrossRef] [PubMed]
- 121. Kaznessis, Y.N.; Snow, M.E.; Blankley, C.J. Prediction of blood–brain partitioning using Monte Carlo simulations of molecules in water. *J. Comput. Aided Mol. Des.* **2001**, *15*, 697–708. [CrossRef]
- 122. Narayanan, R.; Gunturi, S.B. In silico ADME modeling: Prediction models for blood–brain barrier permeation using a systematic variable selection method. *Bioorg. Med. Chem.* **2005**, *13*, 3017–3028. [CrossRef] [PubMed]
- 123. Hitchcock, S.A.; Pennington, L.D. Structure-brain exposure relationships. J. Med. Chem. 2006, 49, 7559–7583. [CrossRef]
- 124. Valko, K. Lipophilicity and biomimetic properties measured by HPLC to support drug Discovery. *J. Pharm. Biomed. Anal.* **2016**, 130, 35–54. [CrossRef]
- 125. Ermondi, G.; Vallaro, M.; Caron, G. Learning how to use IAM chromatography for predicting permeability. *Eur. J. Pharm. Sci.* **2018**, *114*, 385–390. [CrossRef] [PubMed]
- 126. Ong, S.; Liu, H.; Qiu, X.; Bhat, G.; Pidgeon, C. Membrane partition coefficients chromatographically measured using immobilized artificial membrane surfaces. *Anal. Chem.* **1995**, *67*, 755–762. [CrossRef] [PubMed]
- 127. Darrouzain, F.; Dallet, P.; Dubost, J.-P.; Ismaili, L.; Pehourcq, F.; Bannwarth, B.; Matoga, M.; Guillaume, Y.C. Molecular lipophilicity determination of a huperzine series by HPLC: Comparison of C18 and IAM stationary phases. *J. Pharm. Biomed. Anal.* 2006, 41, 228–232. [CrossRef] [PubMed]