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# Thermodynamic and computational analyses reveal the functional roles of the galloyl group of tea catechins in molecular recognition

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## Abstract

Catechins, biologically active polyphenols in green tea, exhibit various biological activities, such as anticancer and antiviral activities, arising from interactions with functional proteins. However, the molecular details of these interactions remain unclear. In this study, we investigated the interactions between human serum albumin (HSA) and various catechins, including some with a galloyl group, by means of isothermal titration calorimetry (ITC), differential scanning calorimetry (DSC), and docking simulations. Our results indicate that the galloyl group was important for recognition by HSA and was responsible for enthalpic gains derived from a larger buried surface area and more van der Waals contacts. Thus, our thermodynamic and computational analyses suggest that the galloyl group plays important functional roles in the specific binding of catechins to proteins, implying that the biological activities of these compounds may be due in part to the physicochemical characteristics of the galloyl group.

### Introduction

Catechins are the major functional components of green tea (*Camellia sinensis*), and some of these polyphenolic compounds show biological activities, including anticancer and antiviral activities [1, 2], resulting from their interactions with proteins [3-9]. A detailed understanding of molecular properties of catechins could lead to applications of catechins in medicine and food chemistry. Although there have been many experimental studies focusing on catechins [5, 8-10], the molecular details of the interactions between tea catechins and the proteins involved in their biological activities have not been fully investigated.

The chemical structure of catechins comprises A, B, and C rings, and some catechins bear a galloyl group (Fig 1A). The main catechins isolated as natural products include (–)-epicatechin (EC), (–)-epigallocatechin (EGC), (–)-epicatechin gallate (ECg), and (–)-epigallocatechin gallate (EGCg); in addition, various non-natural catechins have been synthesized, including (+)-catechin (C), (–)-gallocatechin (GC), (–)-catechin gallate (Cg), and (–)-gallocatechin gallate (GCg) (Fig 1B). Both the natural and the non-natural catechins have hydroxyl groups (two or three) at the 3'-, 4'-, and/or 5'- positions of the B ring and a hydroxyl group at the 3-position



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**Competing interests:** The Kao Corporation provided support in the form of salaries for author TT. This does not alter our adherence to PLOS ONE policies on sharing data and materials. of the C ring. Epimerization at the 2-position of the C ring can be induced by heat or changes in pH [11]. Investigation of the interactions between proteins and various catechin derivatives and the stereoisomers can be expected to lead to a better understanding of the mechanisms by which these compounds are recognized by proteins.

Human serum albumin (HSA), which is the most abundant protein in plasma, interacts with various ligands [12, 13]. For example, flavonoids, including catechins derivatives, interact with HSA [14,15] and are transported to various tissues, resulting in various biological activities. Although it has been already reported that catechins interact with HSA [15,16] and the interaction could increase the cross-reactivity of EGCg with natural IgM antibodies in mouse serum [17], the molecular-level details of how catechins are recognized by HSA remain unclear. Understanding structure-activity relationships requires an understanding of the thermodynamics of ligand-protein interactions, and the combination of isothermal titration calorimetry (ITC) and spectroscopic techniques has been used to investigate the interaction between HSA and (+)-catechin [18]. The thermodynamic parameters obtained from ITC suggested that hydrogen bonds and van der Waals forces are the major binding forces in the interaction. However, only a single catechin was studied, and the molecular details of the interaction were not addressed. Various other experimental techniques, such as mass analysis with a quartz-crystal microbalance (QCM), fluorescence quenching measurements, high-performance affinity chromatography, and affinity capillary electrophoresis, have shown that the galloyl group of catechins interacts strongly with HSA [19-21]. However, most of these previous studies of the protein-catechin interactions were phenomenological and lacked atomic-level insights into the interactions.

In this study, we used HSA and 12 catechins (Fig 1) as a model system to investigate the molecular mechanisms by which proteins recognize catechins. Specifically, we performed



\*\*Synthetic origin

**Fig 1. Chemical structures of catechins.** (A) Chemical structure of the functional groups in catechins, (B) natural epicatechins (top row) and synthetic catechins (bottom row), and (C) ethyl gallate and analogs of the galloyl group and catechinsepigallocatechin gallate.

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thermodynamic analyses of the HSA–catechin interactions, as well as the docking simulations. Thermodynamic analysis is actively used in pharmaceutical research [22, 23], but it is less widely employed in studies about interactions between HSA and catechins. Our strategy involving the combination of thermodynamic analysis with a computational method provided information about the molecular basis of the HSA–catechin interactions, highlighting the importance of the galloyl group in the activity of catechins.

#### Materials and methods

#### Chemicals

EGCg, ECg, GCg, Cg, EGC, EC, and GC were purchased from Kurita Water Industries Ltd. (Tokyo, Japan). (+)-Catechin, Na<sub>2</sub>HPO<sub>4</sub>·12H<sub>2</sub>O NaH<sub>2</sub>PO<sub>4</sub>·2H<sub>2</sub>O, NaCl, and ibuprofen were purchased from Wako Pure Chemicals Co. (Tokyo, Japan). Ethyl gallate (EtGa) was purchased from Tokyo Chemical Industry Co. (Tokyo, Japan). (–)-Epigallocatechin-3'-O-methylether gallate (EGCg-3'-O-Me), (–)-epigallocatechin-4'-O-methylether gallate (EGCg-4'-O-Me), (–)-epigallocatechin-3''-O-methylether gallate (EGCg-3''-O-Me), and (–)-epigallocatechin-4''-O-methylether gallate (EGCg-4''-O-Me) were purchased from Nagara Science Co. Ltd. (Gifu, Japan). Warfarin was purchased from Nacalai Tesque (Kyoto, Japan). HSA was purchased from Sigma-Aldrich Japan (Tokyo, Japan). We used a non-degreased HSA. The HSA was dissolved in a phosphate buffer and the HSA stock solution was prepared by extensive overnight dialysis at 4°C. The purity of HSA was checked by using SDS-PAGE.

#### Isothermal titration calorimetry (ITC)

The binding of the catechins and its analogs to HSA was examined in a VP-ITC instrument (Microcal Northampton, MA). In a typical experiment, the calorimetry cell was filled with a solution of HSA (50  $\mu$ M) in a buffer composed of 50 mM sodium phosphate (pH 6.8). Catechins or its analogs were titrated to a solution of HSA at 298 K at 180-s intervals with stirring at 307 rpm. The data were analyzed with the Origin software (ver. 7) by means of a single-binding-site model. The thermodynamic parameters were obtained from three replicate titrations, where the dilution heats of the ligands were subtracted. Changes in heat capacity ( $\Delta C_p$ ) were estimated from the slopes of linear least-squares plots of  $\Delta H$  versus temperature in the range from 288 to 303 K measured in 5 K increments.

To obtain information about the HSA binding site of catechins, we carried out competition assays using ITC. Warfarin was used as a marker for monitoring site I of HSA. The calorimetry cell was charged with the HSA–EGCg complex ([HSA] = 50  $\mu$ M, [EGCg] = 500  $\mu$ M) or the HSA–EGC complex ([HSA] = 50  $\mu$ M, [EGC] = 500  $\mu$ M) in a pH 6.8 buffer composed of 50 mM sodium phosphate and 1% DMSO. Warfarin solution (500  $\mu$ M in the same buffer) was loaded into a syringe. Warfarin was titrated into the cell containing either HSA or an HSA-EGCg complex at 180-s intervals with constant stirring at 307 rpm. The total amount of heat obtained for each measurement was taken as the total heat quantity ( $\Delta Q$ ), and we verified whether warfarin and the catechins bound to the same site by comparing the  $\Delta Q$  from the interaction between HSA and warfarin. The binding inhibition rate was defined by the equation belowcalculated as follows:

Binding inhibition rate (%) = 
$$100 - \frac{\Delta Q \text{ (HSA-ligand complex)}}{\Delta Q \text{ (HSA only)}} \times 100$$

#### Differential scanning calorimetry (DSC)

The thermal stabilities of HSA and the HSA–ligand complexes were determined by differential scanning calorimetry in a VP-DSC autosampler instrument (GE Healthcare). The cell was heated from 303 to 363 K at a rate of 1 K min<sup>-1</sup>. The concentrations of HSA and the ligands were 50 and 500  $\mu$ M, respectively, in a buffer composed of 50 mM sodium phosphate (pH 6.8). The data analysis was carried out with the Origin software (ver. 7) using a two-state model.

#### **Docking simulations**

Using RDKit software [24], we generated fifteen conformers for each catechin. Based on the 50 conformers for each catechin and HSA (PDB ID: 1AO6) as the target protein, we performed molecular docking simulations with RosettaScripts and the talaris2014 scoring function [25]. Starting structures were prepared by manually placing each catechin at site I or site II of HSA, respectively. For each docking simulation, 2000 putative HSA–catechin complex structures were generated, and the structures were ranked by interface score. Shape complementarity as indicated by the Sc measure, was calculated using the Rosetta libraries [26] as described previously [27]. Accessible surface area was computed with the NACCESS program [28].

#### **Results and discussion**

#### Structure-activity relationships for HSA-catechin interactions

To characterize the HSA–catechin interactions on the basis of the catechin structures and thermodynamic data, we used ITC to analyze the interactions between HSA and the eight catechins shown in Fig 1B. To focus on the roles of the galloyl group, we also analyzed the interaction between HSA and EtGa, which was a derivative of the galloyl group (Fig 1C). The ITC profiles showed that the number of binding sites (*N*) for the eight catechins and EtGa ranged from 1.0 to 1.2 (Table 1), suggesting that all of them interacted specifically to a binding site on HSA. Our ITC results also showed that the catechins having the galloyl group (EGCg, ECg, GCg, and Cg) had higher binding affinities than the catechins without a galloyl group (EGC, EC, GC, and C) (S1A Fig, Table 1). The binding affinity of EtGa was lower than the affinities of the catechins having the galloyl group (S1B Fig), suggesting that it was only in the context of the entire catechin molecule that the galloyl group improved HSA binding affinity. The difference in binding affinities between catechins with and without a galloyl group were similar to

Table 1. Parameters for binding of catechins and ethyl gallate to human serum albumin.

Compound	N	<i>K</i> <sub>D</sub> (μM)	$\Delta H$ (kcal mol <sup>-1</sup> )	-TΔS (kcal mol <sup>-1</sup> )	$\Delta G$ (kcal mol <sup>-1</sup> )	$\Delta H/\Delta G$ (%)
EGCg <sup>a</sup>	$1.1 \pm 0.1$	$2.2 \pm 0.3$	$-4.7\pm0.6$	$-3.0 \pm 0.6$	$-7.7 \pm 0.1$	61
ECg <sup>a</sup>	$1.0 \pm 0.1$	$1.1 \pm 0.1$	$-5.1 \pm 0.5$	$-3.1 \pm 0.5$	$-8.1 \pm 0.1$	63
GCg <sup>a</sup>	$1.2 \pm 0.2$	$8.8 \pm 3.4$	$-3.0 \pm 0.1$	$-3.9 \pm 0.3$	$-6.9 \pm 0.2$	43
Cg <sup>a</sup>	$1.0 \pm 0.1$	$3.5 \pm 0.5$	$-2.8\pm0.6$	$-4.6 \pm 0.7$	$-7.4 \pm 0.1$	38
EGC <sup>a</sup>	$1.0 \pm 0.2$	$20 \pm 16$	$-0.6 \pm 0.4$	$-5.8 \pm 0.7$	$-6.3 \pm 0.4$	10
EC <sup>a</sup>	1.0 <sup>b</sup>	$49 \pm 18$	$-0.8 \pm 0.2$	$-5.1 \pm 0.4$	$-5.8 \pm 0.2$	13
GC <sup>a</sup>	1.0 <sup>b</sup>	$52 \pm 16$	$-1.1 \pm 0.5$	$-4.7 \pm 0.7$	$-5.8 \pm 0.2$	19
C <sup>a</sup>	$1.0 \pm 0.2$	$5.0 \pm 8.6$	$-0.3 \pm 0.1$	$-6.8 \pm 0.7$	$-7.1 \pm 0.6$	4
EtGa <sup>a</sup>	1.0 <sup>b</sup>	46 ± 23	$-1.4 \pm 0.1$	$-4.5 \pm 0.4$	$-5.9 \pm 0.3$	24

<sup>a</sup> Each value is the average of at least three independent measurements.

<sup>b</sup> The binding stoichiometry was fixed to N = 1.

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the results previously reported [15, 21], although the ITC profiles of catechins without a galloyl group were not high reliability due to their low affinities. Therefore we discussed the thermodynamics for the interactions of eight catechins. The thermodynamic profiles revealed that the binding of EGCg and ECg was enthalpy-driven, whereas the binding of the other catechins was entropy-driven. It is tempting to speculate that the difference between the enthalpy-driven binding (such as that for ECg and EGCg) and the entropy-driven binding (such as that for ECg and EGCg) and the entropy-driven binding (such as that for EC and EGCg) and the entropy-driven binding (such as that for EC and EGCg) and the chemical structures of the catechins, that is, to the presence of the galloyl group. Although the binding of Cg and GCg, which are epimers of ECg and EGCg, respectively, was also entropy-driven, the  $\Delta H$  values for the former two compounds were nevertheless more favorable than the values for EC and EGC, which lack the galloyl group (Table 1). Furthermore, the  $\Delta H$  of the interaction between EtGa and HSA was more favorable than the  $\Delta H$  values for the interaction between HSA and the catechins lacking the galloyl group. Our ITC analyses suggest that the presence of the galloyl group, was an important factor determining the thermodynamics of the HSA-catechin interactions.

To further characterize the catechin binding to HSA, we exploited DSC to investigate the thermal stabilities of HSA in the presence and absence of the catechins. Thermal stabilities of ligand-bound HSAs were expected to be higher than those of unbound HSA [29]. Previous studies have shown that catechins could control the biological activities of certain proteins by physically binding to them and thereby improving their thermal stability [30, 31]. In line with these observations, our DSC results clearly showed that the catechins enhanced the thermal stability of HSA, as indicated by its melting temperature ( $T_{\rm m}$ ), and that there was a moderate correlation between thermal stability and binding affinity (R = 0.52) (S2 Fig, S1 Table). In addition, the catechins having the galloyl group showed higher  $T_{\rm m}$  values than those without a galloyl group. These results suggest that the catechins with the galloyl group bound to HSA more tightly, which resulted in a more stable HSA–catechin interaction. Thus, the galloyl group may control the biological activity of proteins through its physical interactions with them.

#### Driving forces for the HSA-catechin interactions

To elucidate the main driving forces for the HSA–catechin interactions, we conducted ITC analyses in the presence of NaCl: if binding affinity is increased by the addition of NaCl, hydrophobic interactions can be considered as the main driving force for binding, whereas if binding affinity is decreased by the presence of NaCl, the main driving force is electrostatic interactions [32]. To elucidate the specific role of the galloyl group, we focused on the following six compounds: EGCg, ECg, GCg, EGC, EC, and EtGa.

With addition of 0.2 M NaCl, the binding affinities of EGCg, ECg, and GCg decreased, whereas the affinities of EGC, EC, and EtGa increased (S3 Fig, S2 Table). Therefore, the driving force for binding of the catechins having the galloyl group (EGCg, ECg, and GCg) was mainly electrostatic interactions, whereas that for EGC, EC, and EtGa was mainly hydrophobic interactions. These results imply that when present in a catechin molecule, the galloyl group enhances the electrostatic interactions between the catechin and the protein.

#### Roles of the galloyl group in molecular recognition

Our ITC data clearly showed that the catechins having the galloyl group bound to HSA more strongly than did the catechins without a galloyl group (Table 1). To investigate the role of the galloyl group in more detail, we performed interaction analyses for EGCg derivatives with a methoxy group either in the galloyl moiety or in the B ring (Fig 1C). The ITC profiles showed that the number of binding sites (*N*) of these methylated catechins ranged from 0.9 to 1.1,



Compound	N	<i>K</i> <sub>D</sub> (μM)	$\frac{\Delta H}{(\text{kcal mol}^{-1})}$	$-T\Delta S$ (kcal mol <sup>-1</sup> )	$\Delta G$ (kcal mol <sup>-1</sup> )
EGCg	$1.1 \pm 0.1$	$2.2 \pm 0.3$	$-4.7. \pm 0.6$	$-3.0\pm0.6$	$-7.7 \pm 0.1$
EGCg-3'-O-Me	$0.9 \pm 0.1$	$1.6 \pm 0.2$	$-9.3 \pm 0.4$	$1.4 \pm 0.3$	$-7.9\pm0.1$
EGCg-4'-O-Me	$0.9 \pm 0.1$	$1.7 \pm 0.1$	$-7.0 \pm 0.1$	$-0.8\pm0.1$	$-7.9\pm0.1$
EGCg-3"-O-Me	$1.0 \pm 0.1$	$0.14 \pm 0.02$	$-7.9\pm0.9$	$1.4 \pm 0.9$	$-9.4 \pm 0.1$
EGCg-4 <sup>''</sup> -O-Me	$1.0 \pm 0.1$	$1.0 \pm 0.1$	$-9.8 \pm 0.1$	$1.6 \pm 0.1$	$-8.2 \pm 0.1$

#### Table 2. Parameters for binding of methylated catechin derivatives to human serum albumin.

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suggesting that these compounds interacted specifically to a binding site on HSA (S4 Fig, Table 2). Although the enthalpic gains for all the methylated compounds were larger than the enthalpic gain for EGCg, no improvement in binding affinity was observed for derivatives with a methyl group in the B ring (EGCg-3'-O-Me and EGCg-4'-O-Me) owing to entropic penalties (Table 2). In contrast, despite showing similar entropic penalties, binding affinity improvements due to larger enthalpic gains were observed for derivatives with a methoxy group in the galloyl group (EGCg-3"-O-Me and EGCg-4"-O-Me); this result implied that the galloyl group of catechins has more potential in improving binding affinities than the B-ring in molecular recognition. The interaction between EGCg-3"-O-Me and HSA showed the most increased affinity ( $K_D = 0.20 \mu$ M, compared to 2.2  $\mu$ M for HSA–EGCg). To seek an explanation for this result, we experimentally calculated  $\Delta C_p$  values, which have been shown to correlate with changes in the size of the protein–ligand interface: specifically, a more negative  $\Delta C_{\rm p}$ means a larger change in the interface size [33, 34]. Plots of  $\Delta H$  versus temperature showed that the  $\Delta C_p$  values for EGCg and EGCg-3"-O-Me were -148 and -195 cal mol<sup>-1</sup> K<sup>-1</sup>, respectively, suggesting that the interface of the HSA-EGCg-3"-O-Me complex was larger than that of the HSA-EGCg complex (S5 Fig, S3 Table). The only difference between EGCg and EGCg-3''-O-Me is the methyl group at the 3''-position of the galloyl group (Fig 1C). Therefore, the higher binding affinities of the catechins having the galloyl group were due to the ability of the galloyl group to increase the size of the HSA-catechin interface.

#### Catechin binding site on HSA

Although we showed that the catechins physically bound to a site on HSA, the nature of the binding site remains unclear. HSA has two pockets, site I and site II, where numerous small compounds have been shown to bind [12, 13]. Previous competition assays and molecular modeling studies suggest that EGCg binds to site I on bovine serum albumin, whose structure is highly homologous with that of HSA [35, 36]. Warfarin also binds to HSA at site I, as indicated by X-ray crystallography [37]. To determine the binding site of catechins on HSA, we used ITC to perform competition assays with warfarin, in which the total heat ( $\Delta Q$ ) derived from the HSA–warfarin interaction was compared with  $\Delta Q$  values for interactions between HSA–EGCg or HSA–EGC complex and warfarin, and a binding inhibition rate was calculated as described in Materials and Methods. These assays showed that  $\Delta Q$  values for the interactions between the HSA–catechin complexes and warfarin were smaller than the  $\Delta Q$  for the HSA–warfarin interaction alone, resulting in smaller binding inhibition rates (S6 Fig). These observations suggest that the binding sites of warfarin, EGCg, and EGC were identical.

#### Origin of the enthalpic contribution of the galloyl group

The thermodynamic analyses described above suggested that the galloyl group of the catechins contributed mainly to the enthalpic gains in the molecular recognition and that the catechins



Fig 2. Correlation between  $\Delta G$  in vitro and interface score in silico for binding of catechins and ethyl gallate to human serum albumin.

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interacted specifically with site I of HSA. One of the best methods for further characterizing the molecular details of protein–ligand interactions is X-ray crystallography. However, such method is often laborious and time-consuming. An alternative is docking simulations that model protein–ligand complexes based on unbound-state structures. Hence, to further interpret the thermodynamic profiles at the molecular level, we employed docking simulations [25] between HSA site I and the 12 catechins, as well as EtGa. For each catechin, we plotted the relationship between the interface scores of the docking simulations and the experimental  $\Delta G$ 





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values from the thermodynamic analysis (Fig 2). A bottleneck in docking simulations occurs in the orientation and conformational sampling of a ligand in the binding site of a protein. To handle this bottleneck, we averaged the interface score over the models with the 10 top scores (S4 Table). We found that the correlation between interface score and experimental  $\Delta G$  was very high (R = 0.90); this high correlation implies that, to a reasonable extent, the scoring function used in the docking simulations were able to capture the physicochemical principles behind the HSA–catechin interactions (Fig 2).

The structures of the model complexes in which the catechins bound to site I of HSA, as well as subsequent buried surface area (BSA) calculations, showed that catechins having the galloyl group had larger BSAs than the catechins lacking the galloyl group; the correlation between BSA and experimental  $\Delta G$  was high (R = 0.82, Fig 3A). Furthermore, EGCg and the methylated derivatives of the galloyl group displayed the larger shape complementarity (*Sc*) than the other catechin derivatives; and shape complementarity was also well correlated with the experimental  $\Delta G$  (R = 0.76) (Fig 3B). The model of the HSA–EGCg complex obtained from the docking simulations is shown in Fig 4. Hydrophobicity mapping using the Kyte–Doolittle scale [38] suggests that site I of HSA has both apolar and polar regions, so that the

galloyl group of EGCg could form a hydrogen bond as well as well-packed van der Waals contacts with the molecular surface of site I ( $\underline{Fig 4}$ ). Thus, these results indicate that the galloyl group of the catechins increased their binding affinity by increasing the BSA and the shape complementarity, primarily by means of well-packed van der Waals interactions with the apolar/polar surface of site I of HSA.

The docking scoring function used in this study consists of several physics-based and empirical terms [25]. To better interpret the docking results, we decomposed the docking scores into their individual score terms. Because our experimental analyses relied heavily on physicochemical principles, we focused on two physics-based terms, that is, the electrostatic contribution (if\_X\_fa\_elec) and van der Waals contributions (if\_X\_fa\_atr and if\_X\_fa\_rep). We found that catechins having the galloyl group had more-negative values than catechins without a galloyl group, both for the electrostatic and van der Waals interactions (S7 Fig). This result suggests that the catechins having the galloyl group tended to exploit these interaction forces more than the other catechins did, and this result is in agreement with our ITC data on the HSA-catechin interactions in the presence and absence of NaCl. Furthermore, the binding affinities measured by ITC were highly correlated with the hydrogen bond energies calculated in Rosetta [25] (S8 Fig, R = 0.94), which suggests that hydrogen bonds were key determinants of the interactions between HSA and catechins.

Finally, to confirm that the catechins bind specifically to site I of HSA and to determine how well site II could accommodate the catechins, we also performed docking simulations with site II. The interface scores of the docking simulations for site I were better than those for site II, implying that the catechins bound more favorably bind to site I, which is consistent with the result of our competition assays showing that the catechins bound to site I (S9 Fig).

#### Importance of galloyl groups in food chemistry and drug discovery

In this study, we investigated the thermodynamic profiles of the interactions between HSA and 12 catechins, and our results indicate the importance of the galloyl group in the molecular recognition of these compounds. This information can be expected to be useful in investigations of the interactions between catechins and proteins other than HSA. Taste is one of the important factors determining the palatability of food. There are five basic taste sensations: sweetness, saltiness, sourness, bitterness and umami. Compounds with galloyl groups are reported to have a strong bitter taste [39]. Bitter compounds activate human bitter taste receptors (hTAS2Rs) [39, 40], but although several proteins related to the bitterness have been identified, how such compounds bind to the protein receptors at the molecular level is not clear. To control bitterness and thus improve the palatability of food, an understanding of the molecular details of the interactions is essential, and our results would help to unveil the physicochemical principles behind the protein–catechin interactions.

Compounds having galloyl groups have already been used as medicines; for example, tannic acid (S10 Fig), which has multiple galloyl groups, has been used to control diarrhea [41]. In the intestinal tract, tannic acid forms an insoluble coating and binds to proteins, inhibiting inflammation, which results in an astringent effect [42]. Moreover, some small molecules with galloyl groups, including a potential anticancer agent, bind to human neutrophil elastase and inhibit its function [43]. To develop drugs that bind specifically to target proteins involved in human diseases, one must optimize the binding affinities and specificities to the target proteins based on structure–activity relationships [44]. Although HSA is a reservoir protein for numerous compounds and we should carefully verify the extrapolating our HSA-catechin interaction to the potential drug-target protein interaction, our strategy based on physicochemical principles and computational methods may become a powerful tool for designing small-molecule

inhibitors and drugs with galloyl groups. In addition, the molecular-level details regarding the function of the galloyl group elucidated in this study may provide us insight leading to target validation for biological functions and to the discovery of natural and synthetic compounds bearing galloyl groups with useful pharmaceutical activities.

#### Conclusion

In summary, our thermodynamic analyses and docking simulations suggest that the galloyl group in tea catechins improves the binding affinity of their binding to HSA; the improvements are the result of larger enthalpic gains for the catechin having the galloyl group, gains derived mainly from larger BSAs, better shape complementarity, and higher hydrogen-bonding propensity. This work is the first to report the physicochemical significance of the galloyl group and the molecular basis of its involvement in protein recognition. Although various reports have shown that the galloyl group of catechins interacts with proteins [10, 45], the molecular details of the binding mechanism were unclear. Our results revealed the functional roles of the galloyl group in molecular recognition at an atomic-level resolution and may facilitate the discovery of new proteins involved in the biological activities of catechins; specifically, screening proteins by means of thermodynamic analyses that focused on  $\Delta H$  generated by the galloyl group would be a plausible approach.

In this study, we focused on the interactions between HSA and 12 catechins as a model system. To generalize our findings and further explore the roles of the galloyl group of catechins, the next logical step would be to extend our analyses to proteins other than HSA, and further work in this area is underway in our laboratory.

## **Supporting information**

**S1 Fig. Comparison of the heats of HSA-ligands and the dilution heats of ligands.** (A) EGCg-HSA, (B) EGCg-buffer, (C) ECg-HSA, (D) Ecg-buffer (E) GCg-HSA, (F) GCg-buffer (G) Cg-HSA, (H) Cg-buffer, (I) EGC-HSA, (J) EGC-buffer, (K) EC-HSA, (L) EC-buffer, (M) GC-HSA, (N) GC-buffer, (O) C-HSA, (P) C-buffer, (Q) EtGa-HSA, (R) EtGa-buffer. (TIF)

**S2 Fig. Thermal stability of HSA upon ligand binding.** (A) DSC curves for HSA unfolding in the presence of ligands.

(B) Distribution of the binding affinity and thermal stability. (TIF)

**S3 Fig. Binding of Catechins and EtGa to HSA in the presence of 0.2M NaCl.** (A) EGCg, (B) ECg, (C) GCg, (D) EGC, (E) EC, (F) EtGa (TIF)

#### S4 Fig.

Binding of EGCg and methylated EGCg derivatives to HSA: (A) EGCg, (B)EGCg-3-O-Me, (C) EGCg-4'-O-Me, (D) EGCg-3"-O-Me, and (E) EGCg-4"-O-Me (TIF)

S5 Fig. Plot of  $\Delta H$  versus temperature for EGCg and EGCg-3"-O-Me. (TIF)

S6 Fig. Binding inhibition rates between HSA–EGCg or HSA–EGC complexes and warfa-rin.

(TIF)

**S7 Fig. Correlation between electrostatic interactions and van der Waals in Rosetta.** (TIF)

S8 Fig. Correlation between the effect of affinity in the presence of NaCl and hydrogen bond energy in Rosetta. (TIF)

S9 Fig.

Correlations between  $\Delta G$  and interface score in silico for (A) site I and (B) site II of HSA. (C) Competitive binding experiments between warfarin (binds at site I) and ibuprofen (binds at site II) and EGCg

(TIF)

S10 Fig. Chemical structure of tannic acid.

(TIF)

**S1** Table. Thermal stabilities and binding affinities of HSA and HSA-catechin complexes. (PDF)

S2 Table. Binding affinities of catechins and EtGa for HSA in the presence and absence of NaCl.

(PDF)

S3 Table. Temperature dependence of binding parameters for the interaction of EGCg and EGCg-3"-O-Me with HAS. (PDF)

S4 Table.  $\Delta G$  and interface scores for the interaction of catechins and EtGa with HSA. (PDF)

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