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# Exploiting non-covalent  $\pi$  interactions **for catalyst design**

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**Molecular recognition, binding and catalysis are often mediated by non-covalent interactions involving aromatic functional groups. Although the relative complexity of these so-called π interactions has made them challenging to study, theory and modelling have now reached the stage at which we can explain their physical origins and obtain reliable insight into their effects on molecular binding and chemical transformations. This offers opportunities for the rational manipulation of these complex non-covalent interactions and their direct incorporation into the design of small-molecule catalysts and enzymes.**

roducts of billions of years of evolutionary pressure, enzyme active sites are flawlessly engineered spaces, with amino acid residues precisely positioned to be complementary to the transition states of the reactions they catalyse with regard to size, shape, charge and any number of additional features<sup>1</sup>. Although the diversity of reactions observed in nature is vast, the underlying principles of molecular recognition of substrate and transition state are similar, and typically emanate from the concerted action of multiple non-covalent substrate–catalyst interactions (such as Van der Waals forces, the hydrophobic effect, electrostatic interactions) that are individually weak (about 0.5–3 kcal mol<sup>-1</sup>) but collectively important<sup>2-4</sup>. These interactions lower the free energy  $(\Delta G)$  as the catalyst–substrate complex (C–S) forms and approaches the transition state (TS in [Fig. 1a\)](#page-1-0), which partially compensates for the energetic uptake required to form the activated complex  $(C - S^{\ddagger})$  and thereby leads to catalysis [\(Fig. 1a\)](#page-1-0). When designing synthetic catalysts that operate by way of such Δ*G* lowering, the array of attractive non-covalent interactions (NCIs) that exist afford seemingly endless approaches to realize it through ground-state destabilization and/ or transition-state stabilization.

Studying molecular binding in the ground state has delivered a relatively sophisticated view of the physical principles underlying NCIs, to the extent that they are often rationally built into supramolecular



<span id="page-1-0"></span>**Figure 1** | **Overview of catalysis and non-covalent**  $\pi$  **interactions. a**, Qualitative depiction of catalysis via transition-state (TS) stabilization, where C is catalyst, S is substrate, and P is product. G<sup>o</sup>, Gibbs free energy in standard state; reaction coordinate indicates the progression of the reaction; C–S‡ , activated complex. **b**, Featured interactions (grey dashed lines) of  $\pi$  systems in this Review.  $X = B$ , C, N, O.

architectures<sup>[5](#page-9-2)</sup>. As transition-state theory fundamentally relies on the treatment of the ground and transition states as being in equilibrium, the factors that govern binding in the former (change in free energy Δ*G*, equilibrium constant *K*eq) are perfectly analogous to those in the latter (free energy of activation  $\Delta G^{\ddagger}$ , rate constant *k*)<sup>[6](#page-9-3)</sup>. It thus seems entirely reasonable to inform the rational design of synthetic catalysts that need to bind the transition state by considering the factors that influence various ground-state NCIs (distance, orientation, substituent effects, and so on) and the strength of binding<sup>7</sup>, as illustrated by the development of smallmolecule catalysts that successfully control stereo- or regioselectivity<sup>8</sup> in numerous transformations via hydrogen-bonding<sup>[9](#page-9-6)</sup> or ion-pairing<sup>10</sup>.

Here we survey within the context of catalysis a class of NCIs that often influence molecular structure, recognition and binding as well as reaction outcomes: aromatic or  $\pi$  interactions<sup>[11](#page-9-8)</sup>. Drawing from knowledge in fields as diverse as crystal engineering, supramolecular chemistry, structural biology, organic synthesis and computational chemistry, we give illustrative examples of  $\pi-\pi$ , XH– $\pi$  (X = B, C, N, O), cation– $\pi$ , anion– $\pi$ , and lone pair– $\pi$  interactions ([Fig. 1b](#page-1-0)) and examine how they can mediate the acceleration of chemical transformations. As our interest is in mechanistic understanding, we focus on examples with rigorously quantified NCIs that can reveal the underlying physical organic principles. In the final section, we consider the prospect of truly *de novo* catalyst design affecting the field of synthetic organic chemistry via the paradigm of transition-state recognition using  $\pi$  interactions as a design element.

#### **π−π interactions**

Among the most studied interactions of  $\pi$  systems, the non-covalent attraction between neutral, closed shell aromatic rings is often characterized using the terms  $\pi-\pi$  interaction or  $\pi$  stacking<sup>[12–15](#page-9-9)</sup>. Four geometries are characteristic of  $\pi$ -stacking interactions: parallel stacked (PS), parallel displaced (PD) and edge-to-face or 'T'-shaped [\(Fig. 2a](#page-2-0)). For the benzene dimer, the 'T'-shaped and PD geometries have been calculated to be approximately equal in stability (about −2.5 kcalmol−<sup>1</sup> ) with the PS geometry much less so (approximately −1.6 kcalmol<sup>−</sup><sup>1</sup> ). Qualitatively, this geometric preference can be understood in terms of molecular quadrupole moments. The six radially oriented C–H bonds of benzene confer a quadrupole moment to the molecule (described by the  $z^2$  component of the quadrupole moment tensor, *Qzz*) such that regions of negative electrostatic potential are found above and below the ring plane, and regions of positive potential

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<span id="page-2-0"></span>**Figure 2** | **Overview of**  $\pi$ **-stacking geometries and evidence for the direct interaction model. a**, π−π interaction geometries (see text for details). **b**, Hammett correlations (interaction energy versus *σ*meta, the *meta*-Hammett substituent parameter) supporting the direct interaction model. Broken red line in insets indicates interaction. Adapted from ref. [26](#page-9-20), American Chemical Society. **c**, Correlations demonstrating geometric consequences of the direct interaction model. Insets show  $Ar^1$  (top) and Ar<sup>2</sup> (bottom); broken red lines in insets indicate interactions. On axes,  $E_{int}(Ar^{1} \times Ar^{2})$ denotes interaction energy between Ar<sup>1</sup> and Ar<sup>2</sup> , and so on. Adapted from ref. [28,](#page-9-21) American Chemical Society. In **b** and **c**, regression lines and their equations are shown: *R*, correlation coefficient.

around the ring periphery. From this perspective, the 'T'-shaped and PD geometries reflect an interaction between regions of positive and negative potential, whereas the PS geometry is electrostatically repulsive owing to overlapping regions of negative potential. However, based on a number of high level *ab initio* studies, it is now generally accepted that dispersion<sup>15</sup> plays a major role in the attractive nature of  $\pi$ –π interactions but is largely cancelled by exchange repulsion $16,17$  $16,17$ . As such, the electrostatic contribution is important when comparing the interaction strengths across a series of substituted homologues.

There have been numerous studies in the past two decades devoted to understanding the physical origins of substituent effects in tuning the strength of  $\pi-\pi$  interactions. Until recently, the prevailing viewpoint, initially put forth by Hunter and Sanders<sup>[18](#page-9-13)</sup>, was based on a  $\pi$ -polarization argument, wherein electron-withdrawing substituents were proposed to remove electron density from an arene's π-system via π-resonance effects (and vice versa for electron-donating substituents)<sup>[19–22](#page-9-14)</sup>. As such, this model predicts that the interaction between two rings in a PS geometry will be strengthened upon introduction of an electron-withdrawing substituent into one of the partners owing to a decrease in repulsion between the two  $\pi$  systems, whereas introduction of an electron-donating substituent should weaken the interaction by the opposite mechanism. An early experimental study corroborating the Hunter–Sanders model was reported by Cozzi and Siegel and co-workers, who prepared a series of 1,8-diaryl naphthalenes, in which the aryl groups were forced in a faceto-face stacking geometry in the ground state by steric constraints $21$ . Assuming that the  $\pi-\pi$  interaction would be completely attenuated at the transition state corresponding to rotation about the aryl–naphthyl bond,

measurement of the rotation barrier would be reflective of the groundstate stabilization of the stacked geometry. In practice, an excellent correlation was found between  $\Delta G^{\ddagger}$  for ring rotation and the *para* Hammett substituent parameter  $\sigma_{\text{para}}$ , consistent with the notion that  $\pi$ -resonance effects were the dominant factor underlying the observed substituent effect.

Recently, however, the  $\pi$ -polarization model has been a source of controversy. *Ab initio* studies have suggested that the introduction of any substituent (that is, electron-donating or electron-withdrawing) should increase the strength of  $\pi-\pi$  interactions compared with the benzene dimer<sup>23</sup>. In fact, the notion that the  $\pi$  systems of the interacting partners are even involved in "π−π interactions" has been increasingly called into question $14,24,25$  $14,24,25$  $14,24,25$ . For example, computations by Grimme have suggested that the interaction energy of cyclohexane 'stacking' (−3.09 kcalmol<sup>−</sup><sup>1</sup> ) is in fact stronger than that of benzene (PD orientation, −2.62 kcalmol<sup>−</sup><sup>1</sup> ) [24,](#page-9-18) and Bloom and Wheeler have shown that the interaction between benzene and cyclohexane  $(-2.91 \text{ kcal mol}^{-1})$  is stronger than that of the benzene dimer (PS orientation,  $-1.63$  kcalmol<sup>-1</sup>)<sup>25</sup>. It has thus been proposed that the  $\pi-\pi$  terminology be reserved for larger aromatic systems in which special π-electron correlation effects do appear to exist. Nonetheless, as it is not our goal to coin new terminology but rather to describe the current state of the art, we have chosen to use the terms 'π−π' or 'π stacking' fully aware of their shortcomings.

A more recent model that is consistent with the majority of available data, popularized by Wheeler and Houk, posits that the direct interactions between the local C–X/H dipoles of substituted aromatic rings determine the strength of a 'π−π' interaction[16,](#page-9-11)[23](#page-9-16)[,26–28](#page-9-20). Viewed from this



<span id="page-3-0"></span>**Figure 3** | **Experiments quantifying effects on π-stacking interactions. a**, Substituent effects on π-stacking interactions detected using molecular torsion balance 3.1 (shown unfolded and folded); Δ*G*o=−*RT*ln*K*eq. **b**, Transition-state interaction energies ( $\Delta G$ <sub>TS</sub>) of rings 2 and 3 during conversion of pyridine of **3.2** (left) to methyl pyridinium (right) using methyl iodide (MeI).

perspective, aromatic rings primarily serve as platforms upon which to place substituents in a spatial arrangement that will either be attractive or repulsive depending on the relative geometries between the interacting dipoles. The calculated interaction energy between benzene and a monosubstituted benzene derivative was found to correlate strongly with the *meta* Hammett substituent parameter  $\sigma_{\text{meta}}$  and was attractive for all substituents evaluated [\(Fig. 2b,](#page-2-0) left), including those considered to be inductively electron-donating (negative  $\sigma_{\rm meta}$ )<sup>[28](#page-9-21)</sup>. Retaining the same intermolecular separation but replacing the substituted benzene ring with a hydrogen atom ([Fig. 2b](#page-2-0), right) afforded an essentially identical correlation, suggesting that the aromatic ring itself is not truly involved in the interaction. Another prediction of the Wheeler–Houk direct interaction model is that substituent effects should be additive—that is, the interaction between two substituted benzene derivatives should be equal to the sum of the individual interaction energies of each substituted ring with benzene. This hypothesis is supported by the excellent 1:1 correlation between these interaction energies shown in [Fig. 2c](#page-2-0) (left). However, this relationship is expected to fail if the substituents on the two substituted rings interact directly as other intermolecular interactions—such as steric repulsion—become relevant [\(Fig. 2c,](#page-2-0) right). Additional computational studies by Parrish and Sherrill have also demonstrated the validity of this hypothesis $29$ .

A recent study by Shimizu and co-workers provided direct experimental support for the Wheeler–Houk additivity hypothesis ([Fig. 3a](#page-3-0)) [30](#page-9-23). Owing to restricted rotation about the imide N–aryl bond, **3.1** (a 'molecular torsion balance') was found to exhibit discrete unfolded and folded conformations in solution. Furthermore, it was demonstrated that the phenyl ether substituent and phenanthrene shelf were forced into a PD stacking interaction in the folded conformation. Thus, measuring the unfolded to folded ratio as a function of phenyl ether substitution allowed the authors to quantify the strength of the  $\pi-\pi$  interaction in the ground state. By comparison with a control molecular torsion balance in which the  $\pi - \pi$  interaction was precluded, the authors defined a substituent effect for several electronically diverse substituents ([Fig. 3a\)](#page-3-0). Notably, the magnitude of the substituent effects for monosubstituted aryl ethers were dependent on the positions of the substituents on the ring (compare 3-Cl and 4-Cl), as would be expected on the basis of the direct interaction model. Furthermore, using the calculated substituent effects for the monosubstituted derivatives, the authors were able to predict those for di- and tri-substituted analogues with reasonable accuracy  $(3,5-Cl<sub>2</sub>)$ . As the Hunter–Sanders π-polarization model does not predict that substituent effects will be additive, these results, along with the observation of a positional dependence of the magnitude of the substituent effect, were taken as evidence to support the Wheeler–Houk direct interaction model.

Considering the manner in which  $\pi-\pi$  interactions can be employed for ground-state stabilization, it stands to reason that they might analogously be used to effect transition-state binding for catalysis. An excellent example of this phenomenon was reported by Hunter and co-workers for the alkylation of pyridine in a supramolecular zipper complex (**3.2**, [Fig. 3b\)](#page-3-0)<sup>[19](#page-9-14)</sup>. It was hypothesized that a  $\pi$ -interaction between the pyridine ring (ring 3) and ring 2 would be more stabilizing in the polarizable  $S_N 2$ transition state than in the ground-state reactant or product complexes. Furthermore, it was anticipated that tuning the electronics of ring 2 might allow for the modulation of the putative transition-state  $\pi$  interaction, thereby controlling the reaction rate. Measurement of the groundstate binding constants (calculated from  $\Delta G$ <sub>GS</sub>) for a series of zipper complexes  $(X = NO<sub>2</sub>, H, NMe<sub>2</sub>)$  and the rates of both the uncatalysed and catalysed alkylation reactions (calculated from  $\Delta G^{\ddagger}_{\,\,\rm free}$  and  $\Delta G_{\rm bound}^{\ddag}$ ) enabled the authors<sup>[19](#page-9-14)</sup> to estimate the binding constant between rings 2 and 3 at the alkylation transition state ( $\Delta G_{\rm TS}$ , [Fig. 3b](#page-3-0)). Using this information, a double mutant cycle analysis $20,31$  $20,31$  allowed for the determination of the isolated contribution of a  $\pi$  interaction between rings 2 and 3 to transition-state stabilization, as well as stabilization of both the reactant and product complexes, in the absence of any additional factors contributing to complex stability (such as dispersion, electrostatic repulsion, hydrogen-bonding). When  $X = NO<sub>2</sub>$ , rings 2 and 3 were engaged in stronger π−π interactions in the reactant and product complexes than in the transition state, implicating negative catalysis. In contrast, when  $X = H$  or NMe<sub>2</sub>, the complexes exhibited stronger  $\pi - \pi$ interactions between rings 2 and 3 in the transition state relative to the ground state, definitively demonstrating the contribution of these interactions to the acceleration of pyridine methylation. The nature of the substituent effect is difficult to discern given the aforementioned geometric complexities of the direct interaction model. However, the clear electronic trend lends credence to the notion that  $\pi-\pi$  interactions can be substantially modulated through subtle electronic perturbations of the structures of the interacting partners to affect chemical reactivity.

#### **XH–π interactions**

The interaction between the C-H bond of an arene (that is, X-H) and the face of another, resulting in a 'T'-shaped geometry [\(Fig. 1a](#page-1-0)), has physical origins similar to those described for the attraction between two aryl rings and is often incorporated into the π-stacking category or even characterized as a type of hydrogen-bonding<sup>32</sup>. We elected to separate CH–π interactions to highlight distinct features from the former class and explore additional XH–π interactions, where X may be C(*sp* hybridized),  $C(sp<sup>3</sup>)$ , B, N, O or a halogen. For example, the computed interaction energies of the C-H bonds in ethane, ethylene and acetylene complexed

with the face of benzene showed a stronger interaction as the carbon exhibited more *s* character<sup>33</sup>. Thus, the identity of the interacting X component is as important as the nature of the  $\pi$  system. To investigate the origins of these NCIs, Wheeler and co-workers examined both X atom identity  $(B, C(sp^3), N, O \text{ and } F)$  and arene substituent effects in a systematic computational study, which revealed that the sensitivity to aryl substitution and the contributions to the interaction energy from dispersion and electrostatic forces varied depending on the identity of the arene substituent (S, [Fig. 4a\)](#page-4-0) [34.](#page-9-28) Overall, electron-donating substituents on the aromatic ring enhanced the interactions for each XH–π combination examined, as established through linear correlations of the computed interaction energies with Hammett  $\sigma_{\text{meta}}$  values. More electronegative atoms (F and O) demonstrated greater sensitivity to the electronic nature of the arene, and the interaction energies were thus dominated by an electrostatic term. Conversely, the CH– $\pi$  and BH– $\pi$  interactions were much less sensitive to the substituent effects, revealing that dispersion dominates in these attractions. Although these computational studies provide detailed insight into the more elusive XH–π interactions, most experimental work has focused on aryl and alkyl CH donors, especially in the context of biological and supramolecular systems.

Alkyl CH $-\pi$  interactions have been extensively acknowledged as an important element in molecular recognition between carbohydrates and proteins<sup>35</sup>. To quantify the stabilization gained from such interactions in the ground state, Waters and co-workers applied double mutant cycle analysis to a β-hairpin oligopeptide, which was designed to allow positions X and Y to interact directly when the β-sheet was folded [\(Fig. 4b](#page-4-0))<sup>[36](#page-9-30)</sup>. The points of interaction between  $Ac_4Glc$  (Glc = glucose) and the aromatic residues were identified through upfield <sup>1</sup>H NMR shifts of H<sub>1</sub>, H<sub>3</sub>, H<sub>5</sub>, and H<sub>6,6</sub><sup>*c*</sup> as well as nuclear Overhauser effect (NOE) experiments [\(Fig. 4b](#page-4-0), right). Double mutant cycles for four aromatic residues revealed weaker interaction energies as the surface area of the π system decreased. In a corresponding trend, a reduced extent of β-sheet folding resulted, indicating lower stability of the folded oligopeptide with decreasing surface area. When a non-aromatic substituent was included

at the X position (cyclohexane), the upfield shifts and NOE signals characteristic of the aromatic groups were not identified, suggesting the two aliphatic groups did not interact. Correspondingly, a low degree of β-sheet folding was measured, and double mutant cycle analysis suggested a trivial interaction energy. Overall, these data suggest that the stabilization of the β-hairpin results from CH–π interactions between the carbohydrate and the aromatic residues. Thus, this model system reveals that an attractive interaction between alkyl C-H bonds and  $\pi$  networks can have a substantial role in the stabilization required for the tertiary structure of a polypeptide.

The potential for CH– $\pi$  interactions to enable the enantioselective recognition of chiral molecules was also explored by Martín and coworkers, who demonstrated the ability of chiral receptor **4a** to distinguish between the  $D$  and  $L$  forms of several aromatic amino acids ([Fig. 4c](#page-4-0))<sup>37</sup>. Using temperature-dependent and 2D-NMR experiments, points of interaction between the host and guest molecules were assigned, revealing that protons R in the ethylene glycol spacer of host **4a** were probably interacting directly with the  $\pi$  systems of the aromatic amino acids. Of note, intermolecular rotating frame Overhauser effects (ROEs) were observed between host 4a (protons R) and D-tryptophan (Trp) but not with L-Trp, suggesting this interaction was important for host-guest selectivity. When ethylene protons were exchanged for fluorine atoms (host  $4b$ ), thus eliminating the putative CH– $\pi$  interactions, diminished binding was observed for the favoured amino acids. In order to quantify the stabilization gained from this CH– $\pi$  interaction, a double mutant cycle analysis was performed. The interaction energy between the receptor protons and L and D-Trp was determined to be  $-0.97$  kcalmol<sup>-1</sup>, which accounted for 70% of the stabilization of the host:D-Trp complex when the selectivity for D-Trp versus L-Trp was considered (10.4:1 or  $\Delta\Delta G_{{\rm D/L}}$  = −1.4 kcal mol<sup>-1</sup>). This example of selective ground-state binding clearly demonstrates how a single CH- $\pi$  interaction might be analogously manipulated to affect selectivity through transition-state interactions.

Despite their prevalence in the ground state,  $CH-\pi$  interactions have been less frequently applied explicitly for transition-state stabilization. Nonetheless, a well-known example of aromatic CH–π interactions in



<span id="page-4-0"></span>**Figure 4** | **Studies of XH–π interactions. a**, Effect of X and arene identity on XH–π interactions. The structure that was computed to determine *E*int in each case is shown boxed at right; S is a variable substituent. Adapted from ref. [34](#page-9-28), American Chemical Society. **b**, Double mutant cycles in β-hairpin oligopeptide to quantify CH–π interactions. Left, the oligopeptide under evaluation, where X and Y are variable substituents. Previous studies support the CH– $\pi$  interactions as shown in the box on

the right. **c**, Chiral host (left) binds amino acid guests (right) selectively through a CH– $\pi$  interaction, as measured by  $K_D/K_L$ . **d**, Rationalization of enantioselectivity in asymmetric transfer hydrogenation of aryl ketones. Top, reaction studied; bottom, calculated diastereomeric transition states (*Si* and *Re* isomers shown left and right, respectively). e.e., enantiomeric excess.

small-molecule catalysis is the rationalization of the origin of enantioselectivity in the Noyori-type asymmetric transfer hydrogenation of aryl ketones<sup>38,[39](#page-9-33)</sup>. Through a detailed computational study, the aryl ligand was proposed to donate a C‒H bond that interacts with the aryl group on the ketone, thus providing stabilization of the '*Si*' diastereomeric transition state, which led to the observed product [\(Fig. 4d](#page-4-0)). Favoured by 2.1 kcal mol<sup>-1</sup>, this calculated transition state (left structure) revealed an interatomic distance of  $3.0\text{ Å}$  between a C-H bond in the cyclopentadienyl ring and the aryl group in the substrate, well within the boundaries of a CH- $\pi$  interaction. Although this specific interaction was not quantified in this example, we view this a posteriori justification of a stereochemical outcome as a foundation for future rational design of such interactions in catalytic systems.

#### **Cation–π interactions**

The cation– $\pi$  interaction describes the association between a cation and the face of a molecule containing a  $\pi$  system<sup>40–45</sup>. First reported for the binding of  $K^+$  to benzene in the gas phase, subsequent experimental studies demonstrated association free enthalpies  $(\Delta H^{\rm o})$  for the alkali metals with benzene of 38.3, 28.0 and 19.2 kcal mol<sup>-1</sup> for Li<sup>+</sup>, Na<sup>+</sup> and  $K^+$ , respectively, placing the cation– $\pi$  interaction among the strongest NCIs known<sup>[40](#page-9-34)</sup>. Rationalized by the quadrupole moment of benzene (see above), electrostatic potential (ESP) maps generally serve as good qualitative predictors of the strength of the cation– $\pi$  interaction as a function of ring substitution $46,47$  $46,47$  $46,47$ , with increasingly electron-donating substituents affording increasingly negative ESPs above and below the ring plane, predicting a stronger interaction with a cation. Thus, to a first approximation, the cation– $\pi$  interaction can be understood as one between an ion and an electric quadrupole (although it cannot be modelled quantitatively in this manner) and is primarily electrostatic in nature. Yet, in certain instances, particularly those involving large, polarizable π systems, the role of induction has also been suggested to be  $\frac{1}{2}$ important<sup>41,[48,](#page-10-1)[49](#page-10-2)</sup>. Wheeler and Houk have warned against misinterpretation of the correlation of ESP maps with stronger/weaker interactions, suggesting that it is the orientations of the local dipoles of the C–H/X bonds around the ring periphery, not the donation or withdrawal of π-electron density from the ring centre by the substituent, that are responsible for the negative ESPs in the case of electron-rich aromatics<sup>46</sup>. In spite of the physical origins of these effects, ring substitution and

adjustment of the spatial extent of a  $\pi$  system can both serve as ways to produce predictable modulation of the strength of cation–π interactions.

Nature provides several excellent platforms for studying cation–π interactions in both ground and transition states. A recurring motif in proteins for the recognition of cationic moieties is the so-called aromatic bo[x42](#page-9-37),[47—](#page-10-0)a term that characterizes binding pockets composed of various combinations of three to four tryptophan (Trp), tyrosine (Tyr) or phenylalanine (Phe) residues precisely arranged to stabilize positive charge via cation– $\pi$  interactions ([Fig. 5a](#page-5-0)). A prototypical example that has been studied by the groups of Lester and Dougherty is that of the nicotinic acetylcholine receptor (nAChR), a ligand gated ion channel that is modulated by the binding of the ammonium group of acetylcholine,  $A<sup>50,51</sup>$  $A<sup>50,51</sup>$  $A<sup>50,51</sup>$ . Using classical physical organic techniques, the authors have demonstrated the half-maximum effective concentration  $(EC_{50})$  of nAChR resulting from ground-state ACh binding can be modulated over 2 orders of magnitude (1.2–114 $\mu$ M, >2.0 kcalmol<sup>-1</sup>) simply through the mutation of a single aromatic box constituent ( $\alpha$ Trp 149) to substituted analogues with attenuated cation binding affinity (such as F-Trp, CN-Trp).

Also featured among the many classes of proteins known to possess the aromatic box motif are those that recognize methylated lysine, a post-translational modification implicated in gene regulation. In 2007, Waters and co-workers reported a study<sup>[52](#page-10-5)</sup> seeking to elucidate the physical origins of the recognition of a cationic methylated lysine (Lys or K) residue on the tail of histone 3 (H3) by the aromatic box of HP1 chromodomain ([Fig. 5a](#page-5-0)). Although the interaction between H3 and HP1 was known to increase with increasing methylation (that is,  $KMe<sub>3</sub> > KMe<sub>2</sub> > KMe$ ), it was unclear if this primarily was due to a cation– $\pi$  interaction or a hydrophobic effect, as the latter may be expected considering the increase in lipophilicity with each methylation. To address this ambiguity, three H3 mutants were prepared varying in the extent of K9 methylation (H3K9Me<sub>3</sub>, H3K9Me<sub>2</sub>, H3K9Me<sub>1</sub>) and one in which K9 had been mutated to a neutral isostere, *tert*-butyl norleucine (*t*-BuNle, H3K9tBuNle). Compared with the wild-type H3 protein, diminished binding was observed with each successive methyl removal, with uncharged mutant H3K9tBuNle displaying 31-fold weaker binding relative to H3K9Me<sub>3</sub>. Given the similar sizes and shapes of these mutants, this result was taken as evidence of a cation– $\pi$  interaction between the cationic H3 mutants and the aromatic residues in HP1 chromodomain.



<span id="page-5-0"></span>**Figure 5** | **Examples of cation–π interactions. a**, Left, depiction of the aromatic box in the HP1 chromodomain binding trimethyllysine (KMe3) of histone 3 (H3: Y, tyrosine; W, tryptophan). Green, HP1 chromodomain carbon; blue, nitrogen; red, oxygen; black, H3 carbon. Right, binding of HP1 chromodomain to wild-type H3 (unmodified) and a series of mutants (tBuNle9, *tert*-butyl norleucine; K9Me<sub>1</sub>, methyllysine; K9Me<sub>2</sub>,

dimethyllysine; K9Me<sub>3</sub> trimethyllysine). Reprinted from ref. [52](#page-10-5), National Academy of Sciences, USA. **b**, Proposed mechanism for hopene synthesis from squalene. **c**, Nucleophilic ring opening of episulfonium ions is stabilized by a cation–π interaction: top, reaction; middle, transition state; bottom, effect of catalyst substituents on product enantiomeric excess.

In the same manner that the ground-state recognition of methyllysine is dictated by cation– $\pi$  interactions, transition-state stabilization can also be manipulated. A field where this paradigm is frequently invoked is that of terpene biosynthesis<sup>53</sup>. In the first definitive example, Hoshino and co-workers studied<sup>54</sup> the enzyme squalene-hopene cyclase (SHC)<sup>55</sup>, which catalyses the formation of hopene (**5.4**) via a complex cationic polycyclization cascade from the acyclic precursor squalene (**5.1**, [Fig. 5b](#page-5-0)). Site-directed mutagenesis studies were conducted to study the electronic effects on Phe 356 and Phe 605, which are components of different aromatic box regions in SHC, implicated in stabilizing cationic intermediates **5.2** and **5.3**, respectively. Estimation of Michaelis–Menten parameters revealed that, although the mutants displayed looser binding relative to the wild type, catalytic activity increased in the expected order based on the ability of the mutated residue to favourably interact with positive charge. Thus, Phe 605 mutants with electron-rich aromatic residues (Phe605Tyr, Phe605OMe-Tyr, Phe605Trp) displayed higher specific activities than the wild-type enzyme, and conversely, fluorinated Phe mutants ( $F_1$ -Phe,  $F_2$ -Phe,  $F_3$ -Phe) at positions 365 and 605 demonstrated progressively diminished catalytic activity with each successive fluorination. A linear correlation was observed between the specific activity of the SHC mutants and the previously computed cation–π binding energies<sup>[46](#page-9-35)</sup> of the  $F_n$ Phe residues. These results convincingly support in a quantitative manner the hypothesis that cation– $\pi$  interactions at both positions within SHC are essential to hopene biosynthesis, presumably via both ground- and transition-state stabilization.

Considering the lessons learned from examples such as those presented above, it should in principle be possible to design synthetic catalysts that accelerate novel reactions via stabilizing cation–π interactions in the transition state. To this end, Jacobsen and co-workers have hypothesized that enantioselectivity, a kinetic phenomenon, can be dictated by aromatic substituents deliberately incorporated into synthetic catalyst scaffolds<sup>56-58</sup>. In an excellent example disclosing the enantioselective nucleophilic ring opening of episulfonium ions with indol[e58,](#page-10-10) the authors proposed that a *meso*-episulfonium ion was generated upon trichloroacetimidate protonation by 4-nitrobenzenesulfonic acid (4-NBSA, [Fig. 5c\)](#page-5-0). A bifunctional chiral thiourea catalyst (**5.6**) was proposed to bind the conjugate base of 4-NBSA and the episulfonium ion in a spatially resolved ion pair through a combination of hydrogen-bonding and cation–π interactions, respectively, allowing an enantioselective nucleophilic attack by indole to occur. The presence of the latter interaction was hypothesized on the basis of the observation that reaction enantioselectivity generally correlated with the size of extended  $\pi$  systems of the catalyst aryl substituent. To distinguish unambiguously whether enantioselection was occurring because of a transition-state-stabilizing cation– $\pi$  interaction in the major pathway or a destabilizing steric interaction in the minor pathway, the authors took advantage of the observation that indole addition to the episulfonium–thiourea complex (**5.5**) was both rate-determining and enantio-determining. The rate constants for the pathways leading to the major and minor enantiomers could be distinguished, and both were shown to independently correlate with reaction enantioselectivity. This experiment rigorously demonstrates that the cation– $\pi$  interaction can be used to achieve transition-state stabilization in a completely designed system that operates by the same principles observed in fundamental, ground-state studies (see above).

#### **Anion–π interactions**

Superficially, anion– $\pi$  interactions emerge as the natural complement to their cationic counterparts, typically describing the attractive association between a negatively charged atom or molecule and the  $π$  face of an electron-deficient (hetero)arene $^{59-62}.$  However, this interaction is somewhat counterintuitive considering the expected electron repulsion between an anion and the π-electron cloud of an arene. Since its original proposal in a series of *ab initio* studies in 2002<sup>63-65</sup>, the anion–π interaction has been extensively studied theoretically and experimentally. Compared with cation–π, anion–π interactions have more shallow potential energy surfaces resulting in relaxed geometric

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requirement[s60](#page-10-13),[61](#page-10-14),[66.](#page-10-15) As such, in the solid state, as opposed to residing directly above the ring centroid (**6.3**), anions are more frequently observed either in the same plane as the aromatic ring interacting with polarized C–H bonds (6.1), or interacting with a ring  $\pi^*$  orbital as in a Meisenheimer complex (**6.2**, [Fig. 6a\)](#page-6-0) [61,](#page-10-14)[67](#page-10-16).

The stabilizing nature of anion– $\pi$  interactions is typically attributed to a combination of electrostatic and ion-induced polarization effects, which can be described by the *Qzz* component of the arene's quadrupole moment and its polarizability, respectively. Notably, these features can display a compensatory effect. As illustrated in [Fig. 6b,](#page-6-0) Frontera and co-worker[s68](#page-10-17) demonstrated computationally that the interaction energy of a chloride anion with a series of (thio)isocyanuric acid derivatives was essentially constant despite a decrease in the  $Q_{zz}$  because of a systematic increase in polarizability  $(\alpha)$  with each replacement of oxygen with sulphur. Additionally, the nature of the anion has a substantial impact on the interaction: smaller anions induce greater polarization in the  $\pi$  system and strengthen the association; and planar, polyatomic ions, such as  $\mathrm{NO_3^-},$ benefit from a  $\pi-\pi$  contribution to the overall interaction.

For benzene derivatives, substituent effects generally follow the trends expected on the basis of electrostatics, with increasingly electronwithdrawing substituents contributing to an enhanced positive electrostatic potential above and below the  $\pi$  face, strengthening the interaction. Like other NCIs involving aromatic rings, this has traditionally been attributed to π-polarization effects, but has more recently been explained on the basis of the Wheeler–Houk direct interaction model<sup>26</sup>, in which an



<span id="page-6-0"></span>**Figure 6** | **Examples of anion–π interactions. a**, Anion–π geometries exemplified in **6.1**, **6.2** and **6.3**. **b**, Effect of polarizability on anion–π interaction. Boxed structure, interaction geometry. Values of parameters are shown under the relevant structures:  $Q_{zz}$ ,  $z^2$  component of the quadrupole moment tensor; *α*, molecular polarizability; *E*, energy. **c**, Neutral receptors for anion binding. Top, depiction of bimolecular association between neutral receptors **6.4**–**6.6** and halide anions Cl<sup>−</sup>, Br<sup>−</sup> and I<sup>−</sup>; bottom, the free energies of association (Δ*G*<sup>o</sup> ).

anion experiences direct, stabilizing interactions with the local dipoles of the C–X bonds located around the periphery of the arene<sup>69[,70](#page-10-19)</sup>. Electrondeficient nitrogenous heterocycles have featured particularly prominently in both theoretical and experimental explorations of anion–π interactions, given their intrinsically positive  $Q_{zz}$  and molecular ESP values  $63-65,71$ It was recently suggested that these last features are consequences of the influx of positive nuclear charge towards the ring centre upon nitrogen incorporation, rather than  $\pi$ -polarization effects<sup>70</sup>. Regardless of their physical origin, both quadrupole moments and ESP maps provide reasonable qualitative guides to tuning the strength of anion– $\pi$  interactions.

In a study quantifying the ground-state association between anions and electron-poor arenes in solution, Johnson and co-workers measured the association constants  $(K_a)$  between the *n*-heptylammonium salts of Cl<sup>−</sup>. Br<sup>−</sup> and I<sup>−</sup> and a series of neutral tripodal receptors (**6.4**–**6.6**, [Fig. 6c\)](#page-6-0) [72.](#page-10-21) The authors anticipated that 2,4-dinitro substituted host **6.4** would interact with the halide series via C–H hydrogen-bonding. However, owing to steric constraints, this binding mode was expected to be precluded for 3,5-dinitro analogue **6.6**, necessitating involvement of the arene faces in anion recognition. Strong association with all three halides was apparent by NMR titration in  $C_6D_6$  (*K*<sub>a</sub>=11–53 M<sup>-1</sup>,  $\Delta G$  = −1.4 to −2.4 kcalmol−<sup>1</sup> ), with the 3,5-disubstituted receptor exhibiting superior binding in all cases in the expected order based on size (that is, Cl<sup>−</sup> >Br<sup>−</sup> >I <sup>−</sup>). Electron-rich control receptor **6.5** did not exhibit measurable binding. On the basis of both NMR studies and DFT calculations, it was proposed that receptor **6.6** bound the halides via a  $\sigma$  complex rather than a true anion– $\pi$  complex, demonstrating the ambiguity often associated with the geometric nature of anion– $\pi$  interactions.

The ability of anion- $\pi$  interactions to stabilize both ground and transition states has been investigated intensively by Matile and co-workers[73–77.](#page-10-22) Illustrative examples can be drawn from the realm of enolate chemistry[74–78.](#page-10-23) A model system was developed in which a malonate moiety was situated near the surface of a naphthalenediimide (NDI) scaffold, which was expected to engage in stabilizing anion– $\pi$ interactions, given the parent NDI's notably positive  $(Q_{zz} = +19 B,$ where 1 buckingham  $(B) = 1 D \text{ Å}$ ) quadrupole moment [\(Fig. 7a](#page-7-0)). It was shown that tuning of the NDI's electronic character via manipulations of the substituents around its periphery enabled the malonate's p $K_a$  to be adjusted over six orders of magnitude ( $\Delta \Delta G_{\text{GS}}$ =  $-7.48\pm0.287$  kcal mol<sup>-1</sup>) compared with diethyl malonate (**7.1**) as a control ( $pK_a$  = 16.4)<sup>78</sup>. An excellent correlation was observed between the LUMO (lowest unoccupied molecular orbital) energies of the substituted NDIs and the observed  $pK<sub>a</sub>$ s. These results were attributed to the ability of the NDI surfaces to engage the enolate conjugate bases in attractive anion– $\pi$  interactions in a manner that could be precisely controlled.

The observation that NDI surfaces could stabilize enolates in the ground state was exploited for transition-state stabilization to control catalytic selectivity [\(Fig. 7b](#page-7-0)) [76,](#page-10-25)[79.](#page-10-26) The addition of malonic acid half thioester (MAHT) **7.3** to β-nitrostyrene proceeded in low yields when catalysed by triethylamine owing to competitive decarboxylation (addition/decarboxylation =  $0.6$ ). It was anticipated that, in the presence of an appropriate NDI catalyst, the planar enolate tautomer leading to the desired addition (a) would be stabilized to a greater degree than the non-planar tautomer leading to decarboxylation (d) and, correspondingly, that the transition state for each would be affected to differing degrees, affecting selectivity (a/d). This hypothesis was verified in practice, as illustrated for catalysts  $7.7$  and  $7.9$  [\(Fig. 7b,](#page-7-0) bottom)<sup>[75](#page-10-27)</sup>. Increasing the π-acidity of the NDI surface through oxidation of the sulfur substituents was observed to progressively improve selectivity in favour of the addition product from a ratio of 1.25 up to 9.6. Furthermore, it was noted that rigidification of the 'Leonard turn' connecting the amine functionality to the NDI surface (**7.7**) led to improved selectivity (compare with **7.9**), presumably by enabling closer contact between the surface and the transition state leading to the major product. Comparison with control catalysts **7.6** and **7.8** provides further support for the notion that anion–π interactions were responsible for the inversion in product selectivity, and initial rate experiments led the authors to conclude that this observation was due to simultaneous deceleration of decarboxylation and acceleration of addition. Overall, these examples embody the means by which the principles underlying ground-state association can be applied to the challenge of rational catalyst design.

#### **Lone pair–π interactions**

The lone pair– $\pi$  (lp– $\pi$ , also referred to as n to  $\pi^*$ ) interaction<sup>80</sup> describes the stabilizing association between a lone pair of electrons and the face of a π system, and is somewhat counterintuitive considering the presumed electron–electron repulsion between these components. Like the anion–π interaction, it is typically expected to be more important for electrondeficient  $\pi$ -systems, and can qualitatively be understood as the interaction between regions of negative (the lone pair) and positive (the *Qzz* component of the traceless quadrupole moment tensor above and below the face of the  $\pi$  system) electrostatic potential<sup>[81](#page-10-29),82</sup>. However, several studies, both theoretical<sup>83-85</sup> and experimental, have noted the shortcomings of this picture and acknowledge the likely significance of electron correlation, or dispersion effects, with weak attractive interactions having been observed for electron-rich aromatic systems with negative quadrupole moments<sup>86</sup>. Although it is expected to be individually quite weak, the significance of the  $lp-\pi$  interaction has been noted in cooperation with other NCIs such as hydrogen-bonding (see below) $87,88$  $87,88$ .



<span id="page-7-0"></span>**Figure 7** | **Substituent effects on anion–π interactions. a**, Modulation of p*K*a values of malonate moiety embedded within naphthalenediimide (NDI) scaffold (**7.2**, bottom) through anion–π interactions compared with diethylmalonate as a control (**7.1**, top). **b**, Top, depiction of differential stabilization of planar (leading to addition product **7.4**) and non-planar (leading to decarboxylation product **7.5**) tautomers of malonic acid half

thioester (**7.3**) by NDI scaffold. Bottom, effect of modulation of NDI (**7.7** and **7.9**) electronic properties on product distribution (addition versus decarboxylation, a/d) and comparison with controls (**7.6** and **7.8**) incapable participating in anion– $\pi$  interactions. Differential transitionstate stabilization is tuned over a range of 1.3 kcal mol<sup>-1</sup>.

The first  $lp-\pi$  interaction to be acknowledged explicitly originates in structural biology as a stabilizing structural element for Z-DN[A89](#page-10-35),[90.](#page-10-36) As shown in [Fig. 8a](#page-8-0), the O4′ oxygen atom of cytidine was crystallographically observed to lie within 2.9 Å of guanine C2 for each d(CpG) step $^{89}$ , and a subsequent *ab initio* study<sup>90</sup> estimated the stabilization gained from this interaction to be of the order of 2 kcal mol $^{-1}$  when guanine was coordinated by  $Mg^{2+}$  at N7. The significance of the lone pair–π interaction in crystal engineering has been noted by Reedijk and co-workers, based on a thorough analysis of the crystallographic database $91$ .

Several key experimental studies have contributed to the understanding of the strength and nature of  $lp-\pi$  interactions. On the basis of observance of a close contact (3.08Å) between the alcohol oxygen and  $C_6F_6$  ring centroid in the crystal structure of amino alcohol **8.1** [\(Fig. 8b](#page-8-0))<sup>[92](#page-10-38)</sup>, Korenaga and co-workers conducted a study on a simplified system to assess the existence of a bona fide  $lp-\pi$  interaction<sup>93</sup>. By studying the association between a series of *N*,*N*-dimethylamino arylethylamines and methanol by <sup>1</sup>H NMR spectroscopy, the authors expected to observe a linear relationship between amine basicity and enthalpy of association  $(\Delta H_{\text{obs}})$  if hydrogen-bonding was solely responsible for the interaction. As shown in [Fig. 8b](#page-8-0) (right), a good correlation was found between Δ*H*obs and Taft's *σ*\* parameter for a range of electronically diverse arylethylamines ( $8.2a-8.2e$ ,  $-6.09$  to  $-5.72$  kcalmol<sup>-1</sup>), with the exception of pentafluorophenyl derivative **8.3** (−6.15 kcalmol−<sup>1</sup> ). This outlier was rationalized on the basis of an intramolecular lp–π interaction supplementing the otherwise weaker hydrogen bond in this complex (**8.3**), whose electron-deficient aryl substituent would be expected to interact favourably with a lone pair. This proposal was corroborated by a notably negative entropy of association ( $\Delta S_{\rm obs}\rm=-19.9$  calmol $^{-1}$  K $^{-1}$ ) as might be expected for the proposed conformationally restricted complex **8.3,** and by a computational analysis that showed good qualitative agreement between the predicted and measured  $\Delta H_{obs}$  for the full data set.

Gung and Amicangelo have investigated lp–π interactions using a molecular torsion balance based on a triptycene scaffold (**8.4**, [Fig. 8c](#page-8-0)) [86,](#page-10-32)[94](#page-10-40). The relative populations of the *syn* and *anti* conformers, which were readily determined by <sup>1</sup>H NMR spectroscopy, were expected to be dictated by the lp–π interaction strength between the C9 benzyl and the C1 methoxymethyl (MOM) substituent. As shown in [Fig. 8c](#page-8-0), the expected trend based on electrostatic reasoning ( $\Delta G^{\rm o}{=}\,1.2$  kcalmol<sup>−1</sup> for  $C_6F_5$  to  $-0.19$  for 4-NMe<sub>2</sub>) was observed. However, the fact that the interaction was attractive even for electron-neutral to electron-rich derivatives  $(H, Me, NMe<sub>2</sub>)$  could not be explained by electrostatic reasoning alone,

leading the authors to invoke dispersion as the dominant force in these latter cases; they concluded that aromatic rings cannot be treated as simple quadrupolar groups at the short distances required for many NCIs<sup>86</sup>. A recent experimental study by Aliev and Motherwell demonstrated that heteroatom substitution might also serve as a means to tune the strength of lp– $\pi$  interactions in a rationally designed system<sup>95</sup>.

To our knowledge, no explicit examples exist of rational catalyst design using lessons from ground-state studies of lp–π interactions such as those highlighted. However, by direct analogy with the situation for  $\pi-\pi$ , cation– $\pi$  and anion– $\pi$  interactions, we fully anticipate examples to be forthcoming. Although not rigorously verified as such, Toste and Sigman invoked a transition-state lp–π interaction between a chiral catalyst and an achiral additive to rationalize an inversion in the sense of enantioselection in an asymmetric fluorination of allylic alcohols (77% enantiomeric excess (e.e.) of R to 92% e.e. of S), based on a series of structure–selectivity studies<sup>96</sup>

#### **Conclusions and outlook**

The preceding paragraphs have provided a limited subset of examples illustrating the analogy between binding in the ground and transition states within the spectrum of specific non-covalent  $\pi$  interactions. Given the seemingly sophisticated knowledge surrounding the physical underpinnings of each interaction discussed, one might inquire as to why genuine *de novo* design of catalysts for novel synthetic transformations is not commonplace. One oft-cited reason is that, although a given NCI's spatial and geometric requirements may be well-understood, its individual contribution to binding may be small and thus in competition with many other interactions, rendering its ability to be manipulated in isolation highly context dependent<sup>97</sup>. Additionally, the design of a catalyst at the outset of a synthetic methodology project would require a detailed understanding of the rate/selectivity-determining transition state—a challenge frequently beyond current capabilities. Indeed, this prevailing viewpoint was recently expressed in a comprehensive review on NCIs in supramolecular catalysis: "non-covalent intermolecular forces are hardly predictable and so far cannot be used by a chemist who wishes to design '*a priori*' a catalyst with assembling properties."[98](#page-10-44)

However, as is so often the case when a dead end seems imminent, perhaps a shift in perspective is required. Although it may not yet be possible to design catalysts that are perfectly complementary to any transition state, it should become increasingly feasible to identify where certain interactions are operative in a mechanism and to use the lessons



<span id="page-8-0"></span>**Figure 8** | **Examples of lone pair–π interactions. a**, Example of lone pair(lp)–π interaction in Z-DNA (broken red line in magnified inset at right). Adapted from ref. [80](#page-10-28), PCCP Owner Societies, and refs [90](#page-10-36) and [96,](#page-10-42) American Chemical Society. **b**, Quantification of lp–π interaction in solution. Box at left, depiction of the dimeric solid-state structure of amino alcohol **8.1** implicating lp–π interactions as important

structural elements. Middle, association between electronically diverse dimethylamino arylethylamines (**8.2** and **8.3**) and methanol in solution, and (right) correlation between enthalpy of association (Δ*H*obs) and the Taft parameter (*σ*\*). **c**, Quantification of lp–π interactions using molecular torsion balances (*anti* and *syn* isomers of **8.4**).  $\Delta G^{\circ} = -RT \ln K_{eq}$ , where *K*eq=[*syn*]/[*anti*].

from ground-state binding to manipulate them rationally. Essential to this goal will be modularity with respect to catalyst design, such that aromatic motifs may be readily installed with varying steric and electronic properties at multiple catalyst positions. To this end, organocatalysts (for example, chiral phosphoric acids, thioureas, amino acids) represent a catalyst class particularly ripe for investigation. Furthermore, in addition to the techniques described above, kinetically controlled product ratios should see increasing use as energetic probes, as these values represent exquisitely sensitive measurements of relative rates arising from subtle transition-state interactions (a 99:1 product ratio results from a 2.7 kcalmol−<sup>1</sup> energy difference between competing transition states). Our groups have recently adopted this approach to deliberately influence enantioselectivity in the realm of chiral phosphate catalysis—this strategy is generalizable to any scenario in which catalyst activity varies as a function of molecular struc-ture<sup>[96,](#page-10-42)99</sup>. By evaluating data sets of enantioselectivity values (that is, relative rates of formation of *R* and *S* enantiomers) from different catalyst and substrate combinations, we have developed hypotheses regarding the NCIs underlying selectivity, allowing us to subsequently manipulate these interactions in explicit, predictable ways. More generally, if this sort of approach were to be adopted at the outset of a catalysis project—that is, NCIs were acknowledged to be possibly relevant—such interactions would be considered as explanations when unexpected results arose.

Given recent advances in high-throughput experimentation capabilities<sup>[100](#page-10-46)</sup>, ever-more creative metrics for describing molecular structure<sup>101</sup>, and computational methods tuned to model  $NCIs<sup>102</sup>$ , the prospects for identifying causal structure–activity/selectivity relationships in catalysis seem bright. It is our hope that these modern technologies can continue to be integrated with classical physical organic methodologies to enable the ultimate goal of truly rational catalyst design to be achieved.

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