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Organometallic-type reactivity of stable organoboronates for selective (hetero)arene C–H/C-halogen borylation and beyond

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Organometallic reagents are essential tools in both academic and industrial laboratories and the polarity separation within the carbon-metal bonds endows them with exceptional reactivities, but also imposes limitations, including air- and moisture-sensitivity, and flammability. Here, we demonstrate that stable and easily accessible benzylic (or allylic) boronate with alkalimetal alkoxide as the activator can act as reactive organometallic reagents. This strategy enables transition metal-free deprotonative C-H borylation of diverse (hetero)arenes. The polar organometallic nature of this process enables predictable and site-selective borylation by targeting the arenes's most acidic C-H bond. This approach can be coupled with Suzuki-Miyaura reaction to produce C-H arylation products. We have also applied this strategy to the dehalogenative borylation of aryl bromides and anionic polymerization of styrenes. Given the unique stability and structural diversity of organoboronates, their organometallic-type reactivities show promise as a powerful alternative to synthetic methodologies that rely on sensitive organometallic reagents.

Organometallic reagents have been a fundamental and indispensable label in both academic and industrial chemical synthesis since their discovery in the early 1900s¹. The polarity separation existing in the carbon-metal bonds endows them with remarkable nucleophilicity and basicity. After a century of evolution iteration, they have been adapted to a wide range of carbanion-based synthetic transformations like C–H deprotonative metalation, metal-halogen exchange, and anionic polymerization^{2–4} (Fig. 1a), providing an alternative to transition metal-catalyzed chemical processes. Their exceptional reactivity also leads to severe limitations, including being highly sensitive to air and moisture, and highly flammable when exposed to air (particularly for organo-lithiums). Organometallic reagents must be manipulated and stored in strictly dried solvents and inert atmospheres. To overcome these issues, innovations for delivering organolithiums like using deep

eutectic solvent⁵, organolithium gels⁶ and continuous-flow processes^{7,8} have been introduced. While these technologies mitigate some sensitivity issues during synthetic operation, organometallic reagents still necessitate stringent air and moisture precautions during both preparation and storage. Therefore, the exploration of versatile and more practical organometallic chemistry schemes remains an active subject.

Organoboronates are widely known as stable organometallic reagents due to the covalent nature of C–B bonds. In the toolbox of synthetic chemists, they are typically used as a carbon coupling unit for the formation of C–C and C–X bonds^{9–11} (e.g., Suzuki-Miyaura crosscoupling)^{12–14}, where boronic ester units act as key leaving groups (Fig. 1b). Although organoboronates have less polarized C–B bonds compared to the celebrated organometallic reagents like organolithium and Grignard reagents¹⁵, it has been reported that several types

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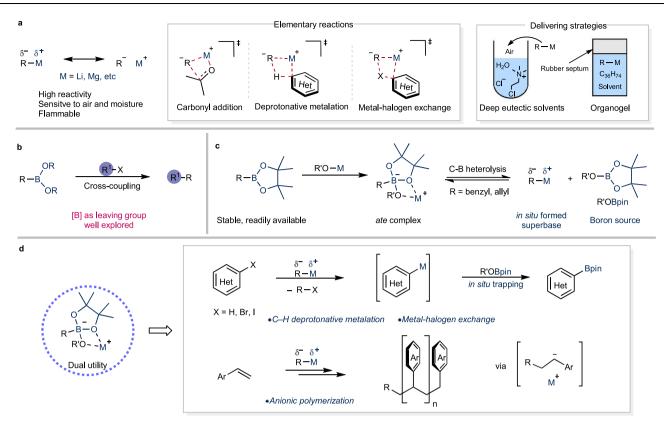


Fig. 1 | **Multifaceted reactivity of organometallic reagents. a** Representative elementary reactions of polarized organometallic reagents (e.g., organolithium, organomagnesium reagents, etc.) and exemplified strategies for delivering sensitive organometallic reagents. **b** Organoboronates are typically used as a crosscoupling partner for C–C bond constructions with boron unit [B] as a leaving group. **c** In the presence of alkali-metal alkoxides, benzylic (or allylic) boronates might be

considered as both superbase precursors and boron sources through the in situ heterolysis of the C–B bond. **d** Outline of the possible transformations using organoboronates/alkali-metal alkoxides combinations as reactive organometallic reagents via deprotonative metalation, metal-halogen exchange or anionic polymerization, in analogy to sensitive organolithiums, organomagnesiums, etc.

of organoboronates (such as benzylic boronates, etc.) could undergo heterolytic cleavage of C–B bonds when associated with alkali-metal alkoxides (ate complex), generating more reactive carbanion species¹⁶. We therefore envisioned that stable organoboronates could function as a distinct type of highly reactive carbanion precursor (Fig. 1c), capable of replicating the polar reactivity known in classical organometallic reagents. These in situ generated carbanions could therefore be used in similar mechanistic scenarios to those involving superbases (e.g., C–H deprotonative metalation, metal-halogen exchange, etc), substantially expanding the synthetic versatility of organoboronates. More importantly, leveraging their unique stability and widespread availability, the use of these organoboronates as superbase precursors offers a simple, practical, and user-friendly alternative to conventional carbanion-based synthetic methods.

Here, we report the dual utility of benzylic (or allylic) boronates, which can not only replicate the reactivity of highly reactive organometallic reagents but also serve as boron sources (Fig. 1d). The combination of benzylic (or allylic) boronates and alkali-metal alkoxides could in situ afford the related carbanions, and their capacity to deprotonate C–H bonds and undergo metal-halogen exchanges has enabled the development of borylation reactions with broadly available (hetero)arenes and aryl bromides through in situ trapping by the borate ester species. This strategy for in situ generation of organometallic species could also initiate the anionic polymerization of aromatic alkenes^{17,18}. In comparison with the synthetic processes based on organometallic reagents^{19–21}, the advantage of this strategy lies in its stable and easy-to-handle precursors and easy control of reactivity through the flexible selection of different boronates/alkali-metal alkoxide combinations.

Results

Reaction development and mechanistic insight

We initiated our study by screening appropriate boronates as the potential precursors of carbanions (Fig. 2a). Density functional theory (DFT) calculations show that the combinations of benzylic (1a-c) or allylic (1d) boronate/potassium tert-butoxide (KO'Bu)²² are predicted to be kinetically feasible, allowing C-B heterolytic cleavage to generate the related resonance stabilized carbanion intermediates $(\Delta G^{\dagger} = 16.0 \sim 19.5 \text{ kcal/mol})$. The activation of *tert*-butyl borate 'BuBpin (1e) with KO'Bu is thermodynamically and kinetically unfavorable $(\Delta G^{\dagger} = 33.5 \text{ kcal/mol})$. To investigate the potential superbase reactivity of these combinations, we chose the deprotonative borylation of N-methylindole 2, using boronates 1a-e as the boron sources and KO'Bu as a moderate base (Fig. 2b). As expected, reactions of benzylic (or allylic) boronates (1a-1d) with N-methylindole, excluding 'BuBpin (1e), consistently produced C2 borylated indole with moderate to excellent yields (see Supplementary Table 1 for optimization details). It should be noted that the optimal boron source, dimethyl benzylic boronate (1c), is readily synthesized through a nickel-catalyzed hydroboration reaction of α -methylstyrene (51% yield, in 50 mmol scale)²³, a significant by-product of the cumene process (over 292,000 tons annually²⁴). In addition, these boron compounds are stable to air and moisture. Furthermore, the involvement of a transition-metalmediated mechanism was excluded by the deliberate introduction of catalytic amounts of several transition metal catalysts, which did not result in any performance enhancement (Supplementary Fig. 4).

Control experiments and NMR analysis were then performed to elucidate the borylation mechanism. As shown in Fig. 2c, the observed ¹H NMR signals at 6.12, 5.20, and 4.43 ppm on the reaction mixture of

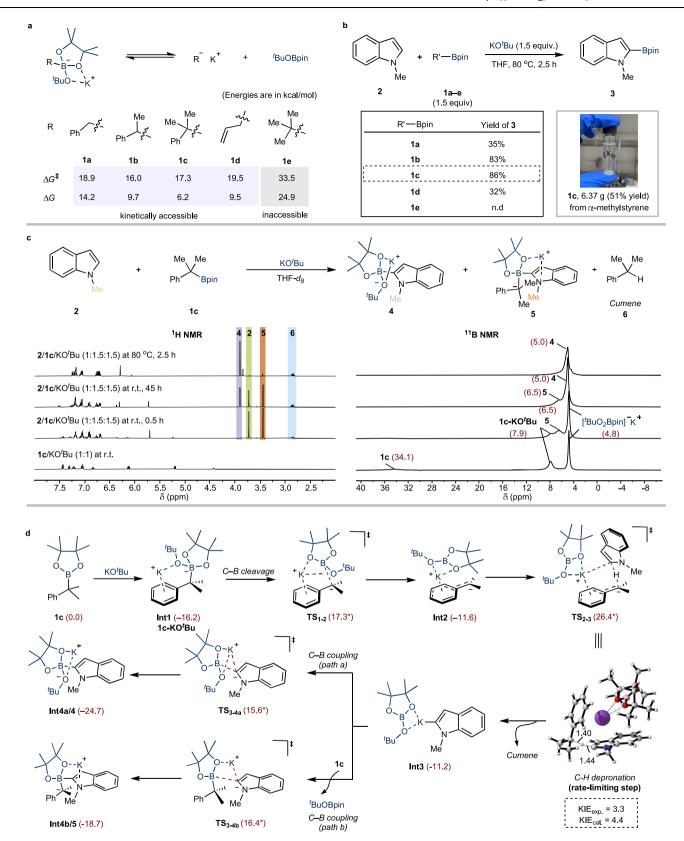


Fig. 2 | Exploration of the superbase reactivity of organboronates, application for aromatic C–H borylation reaction, and mechanistic insight.

a Computational screening for the possible organoboronates/KO'Bu combination, which could undergo C–B bond heterolysis to generate carbanion species (ΔG^{\dagger} : activation barrier; ΔG : reaction energy). **b** Experimental evaluation of the reactivity of different organoboronates for the C–H borylation of N-methylindole **2**. **c** 1 H and 11 B NMR (400 MHz, THF- d_{S}) studies on the model reaction. Numbers within the

parentheses are the boron resonances. **d** Computed pathways [M06-2X/def2-TZVPP, SMD(THF)]/M06-2X/def2-SVP, SMD(THF)] for C–H borylation of N-methylindole with benzylic boronate 1c/KOʻBu combination. The Gibbs free reaction energies (relative to 1c) and barriers (labeled with an asterisk, relative to 1nt1) are in kcal mol⁻¹. KIE: Kinetic Isotope Effect (KIE_{exp}.: experimental measured KIE; KIE_{cal.}: computed KIE with 1c-TS₂₋₃). Color code: H, white; C, gray; B, pink; O, red; N, blue; K, purple.

1c/KO'Bu confirms the formation of the benzylic carbanion species¹⁶ (see Supplementary Fig. 8). The detection of cumene as a by-product in the borylation reaction mixture identified the deprotonation metalation process, which could also be supported by the borylation reaction using independently synthesized dimethyl benzylic potassium (PhCMe₂K) as the base (Supplementary Fig. 5). Replacing dimethyl benzylboronate **1c** with 'PrOBpin, which is a commonly used boron source for the deprotonative borylation of arenes with organometallic reagents²⁵, failed to yield any borylation product (Supplementary Fig. 6). This outcome might be attributed to the irreversible binding of ⁱPrOBpin to KOⁱBu. For the reaction mixture at room temperature, two distinct types of ate complexes 4 and 5 (formed by complexation of borylation product 3 with KO'Bu and dimethyl benzylic carbanion, respectively) could be detected on the ¹H NMR and ¹¹B NMR spectrum (Supplementary Figs. 10-11 for detailed characterization). ¹¹B NMR analysis on the mixture of PhCMe2K with borylation product 3 provides spectroscopic evidence for the formation of carbanion-indole borate complex 5 in the reaction mixture (Supplementary Fig. 12). Despite extending the reaction time to 45 h at room temperature, the indole reactant did not achieve complete conversion. When the reaction mixture was heated to 80 °C, the KO'Bu-bounded indole borate 4 became the predominant species, with only a small amount of species **5**. This suggests that the formation of the tetracoordinated borylation product 4 is thermodynamically more favorable than that of the other ate complex 5. Furthermore, the detection of cumene 6 as a byproduct in the borylation reaction mixture implied the involvement of a deprotonation metalation process.

Density functional theory (DFT) calculations were performed on the model reaction involving benzylic boronate 1c, N-methylindole 2, and KO'Bu, indicating that the deprotonative borylation mechanism is both kinetically and thermodynamically feasible (Fig. 2d and Supplementary Fig. 36). Competing pathways, such as C2-H and C3-H deprotonative borylation as well as carbanion addition/ring-opening pathway, were systematically identified using our combined molecular dynamics and coordinate driving methods^{26,27} (Supplementary Figs. 40-41). Among these, the C2-H deprotonative borylation pathway is identified as the most kinetically favorable path. This deprotonative metalation/borvlation mechanism resembles the ionic mechanisms involved in the KO'Bu-catalyzed C-H bond silylation of aromatic heterocycles^{28,29}. The borylation reaction starts with the complexation of KO'Bu with 1c, resulting in the formation of the ate complex Int1. Int1 then undergoes C-B bond heterolysis through transition state TS₁₋₂ to yield the zwitterionic complex Int2. This complex comprises a benzylic potassium fragment and a boronate ester fragment (BuOBpin). The kinetic feasibility of this process is supported by NMR analysis (Supplementary Fig. 8). Subsequently, the benzylic potassium fragment of Int2 deprotonates the C2-H of indole, leading to the formation of the C-H metalation intermediate Int3 ('BuOBpin-K-indole) with an activation barrier of 26.4 kcal mol⁻¹ (via TS₂₋₃ relative to Int1). Potassium indole Int3 can react with either BuOBpin or 1c, affording ate complexes Int4a (4) and Int4b (5), respectively. Both of these pathways are kinetically accessible, with activation barriers of 15.6 and 16.4 kcal mol⁻¹ for the transition states TS_{3-4a} and TS_{3-4b}, respectively. The 'BuO-indole borate complex (Int4a) is predicted to be more thermodynamically favorable by 6.0 kcal mol⁻¹ compared to the dimethyl benzylic carbanion-indole borate complex (Int4b), aligning with our experimental observations (c.f., Fig. 2c). Given that the initial concentration of **1c** is significantly higher than that of 'BuOBpin, it is likely that the predominant C-B coupling process at room temperature might involve the reaction of potassium indole (K-indole) with 1c. Along the whole borylation process, the C2-H deprotonation step is the rate-limiting step with an overall free-energy barrier of 26.4 kcal mol⁻¹. Parallel kinetic isotope effect (KIE) experiments also reveal a pronounced KIE value of 3.3 ($KIE_{cal} = 4.4$), providing further support for the DFT calculations.

Additionally, our calculations show that the cation- π interaction between the K⁺ cation and the indole ring can significantly lower the energy barrier of C-H deprotonation transition state (Supplementary Fig. 38). The addition of 18-crown-6 to complex with the K⁺ cation reduced the borylation yields (Supplementary Fig. 7), suggesting the crucial role of cation- π interactions in the related transition states. Further computational comparative analysis on the reaction with LiO'Bu and NaO'Bu through DFT calculations elucidates the critical role of K⁺ in mediating indole deprotonation processes (Supplementary Fig. 42). Besides, the solvent coordination effect was also computationally investigated. It was found that THF-solvated microscopic states are also likely to co-exist in the reaction system (Supplementary Fig. 43). In addition, we also computationally investigated C-H borylation reaction of N-methylindole with 1d as the boron source. It was found that the reaction of 1d with N-methylindole requires a noticeably higher activation barrier in the C-H deprotonative step (see Supplementary Fig. 44 for the computed free energy profile).

Synthetic scope for regioselective C-H borylation reaction

The selection of boron source for the deprotonation borylation of different aromatic compounds can be customized according to the C-H bond acidity in the substrates. An experimental study involving a 3×4 matrix, which comprises 3 (hetero)aromatic substrates (Nmethylindole, methoxybenzene, 2,3-benzofuran) and 4 boronate reagents (1a-1d), has established a general guideline for choosing appropriate substrate-boronate combinations (Supplementary Fig. 22). N-methylindole, with a moderate C2-H p K_a value of 37.2, can be efficiently borylated by both methyl and dimethyl benzylic boronate (1b and 1c) to yield products with excellent yields. In contrast, methoxybenzene with a higher ortho-C-H p K_a value of 41.3, only reacts with dimethyl benzylic boronate **1c** to afford the borylation product. For the more reactive 2,3-benzofuran, with a C2-H p K_a of 32.7, both benzylic boronate 1a and allylic boronate 1d are suitable boron sources for the borylation reaction. DFT calculations can differentiate the reactivity of these different combinations and have shown that the activation barriers are well-correlated with the calculated pK_a values (Supplementary Fig. 45).

Following a substrate-adaptive investigation, the substrate scope for the borylation reaction was explored. Generally, the borylation reaction occurs at the most acidic position of the substrate. As illustrated in Fig. 3a, substrates with pK_a values between 34.5 and 41.3 can be effectively borylated using benzylic boronate 1c. A range of N-substituted indoles, including those with methyl (Me), ethyl (Et), and phenyl (Ph) groups, all undergo regioselective C2-H borylation with moderate to good yields (3, 7-8). The scalability of this method is exemplified by a 5 mmol scale synthesis using N-methylindole, demonstrating the practicality of this method. Despite the benzylic C(sp³)-H bonds being more acidic than C(sp²)-H bonds, the borylation of methylated indoles proceeds with complete chemoselectivity at the sp² hybridized C-H positions (**10,12-13**). DFT calculations reveal that the observed chemoselectivity is thermodynamically dictated, with C(sp²)-B bond formation being energetically favored over the formation of benzylic boronate (see Supplementary Fig. 46 for computational details). Furthermore, a variety of substituents at different positions on the indole framework, such as methyl, methoxy, fluoro, chloro, and trifluoromethyl, are well-tolerated, affording the desired products 9-17 in yields ranging from 43% to 76%. Although the C(sp²) -H borylation of aromatic compounds has been well established (for example, using iridium catalysts)³⁰⁻³³, the regioselective borylation reaction is typically achieved by employing a directing group strategy³⁴⁻³⁷ or ligand engineering³⁸⁻⁴¹. In contrast, our method selectively targets the most acidic C(sp²)-H bonds of the substrates, leading to excellent regioselectivity in borylation. In addition, this approach offers a distinct, orthogonal strategy compared to borylation prothrough the electrophilic borylation mechanism⁴²⁻⁴⁴.

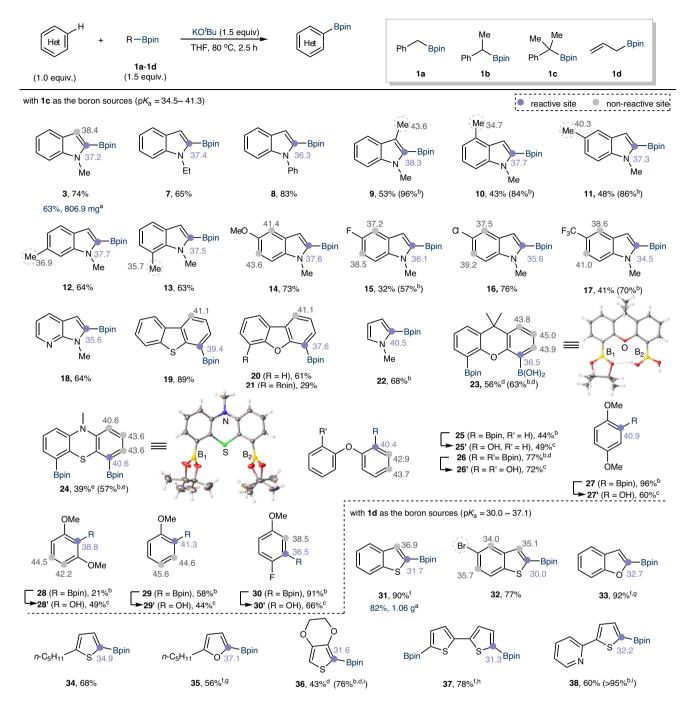


Fig. 3 | **Substrate scope for the C-H borylation of (hetero)arenes.** The numbers labeled on the arenes are the calculated pK_a values of the related C-H bonds. Reaction conditions: substrates (0.2 mmol), **1c** or **1d** (1.5 equiv.), KO'Bu (1.5 equiv.) in 1.0 mL of THF at 80 °C, 2.5 h, under Ar. a 5 mmol scale. b Yield determined by 1 H NMR due to the product decomposition during the purification. c Cascade C-H

borylation/hydroxylation: NaBO $_3$ ·4H $_2$ O (3.0 equiv.), THF/H $_2$ O = 1:1 at room temperature, 3 h. 4 **Ic** or **1d** (3.0 equiv.) and KO 4 Bu (3.0 equiv.). 5 **Ic** (4.2 equiv.) and KO 4 Bu (4.2 equiv.). 6 Without further purification by column chromatography on silica gel. 8 **Id** (1.1 equiv.) was used. 8 **Id** (2.2 equiv.) and KO 4 Bu (2.5 equiv.). 1 At 60 $^\circ$ C, 2.5 h. Color code: H, white; C, gray; B, yellow; O, red; N, blue; S, green.

Furthermore, this strategy for C–H borylation can be extended to other heteroarenes commonly found in bioactive molecules, including 7-azaindole, dibenzothiophene, dibenzofuran, and pyrrole, affording the related mono- or bis-borylated products in good to excellent yields (18–22). The diborylation of 9,9-dimethylxanthene derivative **S23** and phenothiazine derivative **S24** proceeded effectively using 3-4 equivalents amount of boron source, affording the corresponding diborylation products **23** and **24** in moderate yields (63% and 57% NMR yields, respectively). Notably, X-ray crystallographic analysis of the 9,9-dimethylxanthene derived product **23** revealed two divergent boron

substitution patterns, providing structural flexibility that enables regioselective elaboration in downstream synthesis. C–H borylation of aryl ethers could also be achieved, yielding the corresponding *ortho*-borylation products in moderate to good yields (25–30). 1,3-dimethoxybenzene (**528**), which poses significant steric hindrance and is challenging through traditional transition-metal-catalysis⁴⁵, could also be borylated to produce **28**. It has been shown that aryl fluorides readily undergo nucleophilic substitution reaction when treated with benzylic organoboronates and alkoxide base, affording C–C coupling product⁴⁶. However, for 4-fluoroanisole (**\$30**), the C–H borylation

reaction is favorable, and preferentially occurred at the *ortho*-position relative to the fluorine group. The observed regioselectivity might be attributed to the increased acidity of the C–H bond *ortho* to the fluorine atom^{47,48}, rather than by complex-induced proximity effects (CIPE)⁴⁹. Given the high susceptibility of aryl ether boron compounds to decomposition during separation processes⁵⁰, we adopted a two-stage borylation/oxidative hydroxylation protocol to directly transform the borylation product into phenol derivatives (**25′-30′**), which are frequently found in natural products and pharmaceuticals⁵¹.

For O- and S-containing heteroaromatics with lower pK_a (30.0 ~ 37.1), the commercially available allyl pinacol boronate **1d** could also serve as an optimal boron source for the borylation reactions (31-38). This includes the synthesis of building blocks for organic photo-electric materials⁵², such as borylated benzothiophenes and thiophenes (31, 37). Since propylene is the sole by-product (Supplementary Fig. 13), the borylation product can be conveniently obtained through a series of quenching → extraction → solvent recycling steps (e.g., 31, 33, 35, and 37). In addition, the borylation of benzothiophene can be scaled up to a 5 mmol reaction, yielding the desired product in 86% yield. While the aryl C-Br bond is typically reactive in the presence of organolithium reagents, it remains intact when using the combination of **1d**/KO^tBu for the borylation of 5-bromobenzo[*b*]thiophene (32). Notably, treatment of 1-methylindazole with boronate/KO'Bu combinations (1c or 1d) under standard conditions did not produce the anticipated borylation product. Instead, the pyrazole ring undergoes a ring-opening reaction to afford a benzonitrile derivative (Supplementary Fig. 15). This reaction outcome is consistent with previous studies of 1-methylindazole decomposition reaction in the presence of organolithium/magnesiums⁵³. These reaction outcomes provide another evidence for the organometallic-like reactivity inherent to boronate/KO'Bu combinations. In addition, we also explored other heterocyclic substrates (e.g., benzothiazoles, benzoxazoles, and benzimidazoles etc.) with low pK_a values. However, the reactions of these heterocycles failed to form the corresponding boronate esters. These outcomes may stem from the existence of other unidentified competing pathways specific for these substrates (see Supplementary Fig. 54 for a collection of unsuccessful substrates).

Machine learning (ML) methodologies have recently been proven to be highly valuable in synthetic chemistry, including reaction outcome prediction, retrosynthetic route planning and catalyst design⁵⁴⁻⁵⁹. We, therefore, employed ML to explore the substrate adaptivity across diverse (hetero)arene/boronate combinations. To ensure the generalizability of the model, iterative training strategy was adopted (see Supplementary Fig. 56). After two rounds of model iteration, the generalizability of the model was significantly improved as evidenced by the decreasing of mean absolute error (MAE) on the external validation set from 29.0% to 15.4% (Fig. 4a). Algorithm screening through comparative analysis demonstrated that Support Vector Regression (SVR) exhibited significant predictive superiority relative to alternative machine learning architectures within our experimental dataset (Fig. 4b and Supplementary Tables 9-11 for details). Feature importance analysis revealed that the LUMO energy of the boronate compound and the charge of the hydrogen atom on the (hetero)arene (which might be related to the C-H deprotonative process) are the most critical descriptors for reactivity prediction (Fig. 4c). The final model results (Fig. 4d) demonstrate that while our targeted data augmentation successfully captured greater chemical heterogeneity, this approach led to a slightly increase of MAE in the training set (from 7.6% to 12.5%). The observed decline in model accuracy likely stems from the introduction of chemically distinct motifs absent in the initial training set (such as benzoxazole, a substrate with a relatively low pK_a of 25.1). Introducing such chemically diverse samples could exacerbate data heterogeneity, given that the original dataset is predominantly clustered around pK_a values of about 30 ~ 47. Figure 4e exemplified the predictive ability of our optimized model through experimental verification. For instance, it accurately predicted a favorable outcome for the unseen substrate N-methylpyrazole using 1d as the boron source (\$40, 39% predicted vield and 43% observed vield). Besides, it exhibited satisfactory accuracy in boron source selection: for 5-fluoro-1-methyl-1H-indole, the model correctly prioritized **1b** over **1c** (63% versus 57%), while for 1methyl-7-azaindole, the 1b-mediated system showed superior experimental yields (78% versus 64% with 1c). Both cases are in good consistence with computational predictions. However, the model underestimated the yield for 4-fluoro-N,N-dimethylaniline (\$39), predicting 29% yield versus an experimental yield of 75% (with 1c). This discrepancy might stem from the limited number of examples with similar substitution patterns in the training data, hindering the model's ability to effectively capture the competing electronic influences exerted by the amino and fluoro substituents on the substrate. Overall, through iterative data augmentation strategies, we progressively enhanced the model's generalization capabilities, enabling more robust predictions across extensive and diverse chemical space.

Synthetic application and scope extension

We then investigated the application of this strategy for the functionalization of high-value-added arenes. Axially chiral 1,1'-bi-2naphthol (BINOL) derivative \$4260, a crucial ligand in asymmetric catalysis, readily reacted with 1c to yield the 3,3'-bisborylated product 42 in 76% yield on a 1.0 mmol scale (Fig. 5a). While this transformation was previously achievable using "BuLi through a two-stage deprotonation/borylation process⁶¹, it necessitated cryogenic conditions and careful handling of the sensitive "BuLi reagent. The antiplatelet agent ticlopidine \$43 underwent C-H borylation to yield the borylated product 43 in excellent yield (Fig. 5b). Given that this borylation approach yields tetracoordinated aryl boronates, it can be directly utilized in palladium-catalyzed Suzuki-Miyaura crosscoupling reactions¹⁴, offering a step-economical route for drug modification (44-46). For instance, employing 1,2-bis(4-bromophenyl)diazene (λ_{max} = 335 nm) as the coupling reagent, a bis-coupling product was obtained in high yield. The unique light absorption characteristics of 46 (λ_{max} = 413 nm, Supplementary Fig. 24), suggest its potential application in the field of photopharmacology⁶². Moreover, (-)-menthol derivative **S47** and (\pm) - α -tocopherol derivative **S48** proceeded well under standard conditions using 1d as the boron source, affording the borylated products 47 and 48 in 63% and 83% yields, respectively.

To further showcase the versatility of our method, we extended its application to dehalogenative borylation reactions, which are commonly conducted with organometallic reagents or via Miyaura borylation^{63,64}. A two-stage borylation followed by Suzuki-Miyaura coupling demonstrated the applicability of this strategy in the borylation of aryl bromides (Fig. 5c). We also performed DFT calculations on the mechanism of debromoborylation (see Supplementary Fig. 48 for computational details). While 1,1-bis[(pinacolato)boryl]alkanes have been reported for the borylation of aryl and vinyl halides, their reactions with aryl bromides typically exhibit low efficiency⁶⁵. Utilizing 1-phenylethyl boronate (1b) as the boron source, a wide range of aryl bromides could be successfully borylated and subsequently coupled with 2-bromopyridine via palladium catalysis, yielding the corresponding biaryls in moderate to excellent yields (49-65). A range of functional groups, including dimethyl amine (55), benzyl-protected phenol (57), tert-butyldimethylsilyl (TBS) protected alcohol (58), amide (62) and heterocycles (63-65), were found to be compatible with this process. In addition, aryl iodide 4-iodoanisole could also undergo a cascade borylation/Suzuki-Miyaura process to produce the biaryl product (56) with good yield. DFT calculations on different parahalogenated anisoles (Supplementary Fig. 51) revealed differences in reactivity and selectivity among the various para-halogenated anisoles. Performing the stereochemical scrambling experiments with the

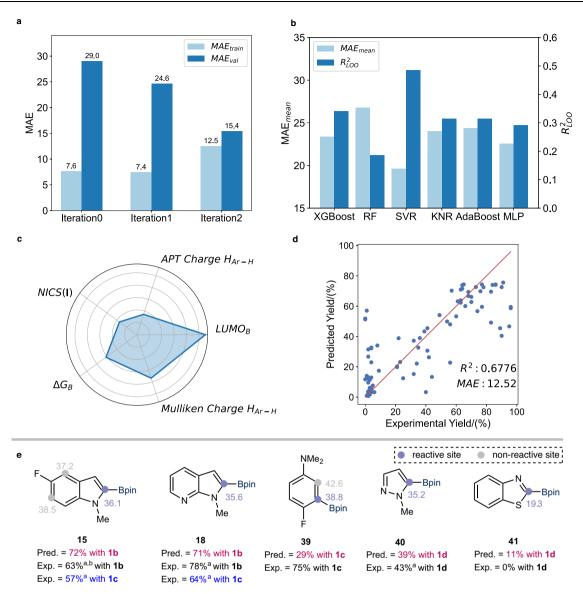


Fig. 4 | Development, analysis, and predictive application of a machine learning model for borylation reactivity. a Model performance (training and validation) across iterative data augmentation rounds. b Comparative performance of different ML algorithms leading to the selection of SVR. c Feature importance analysis identifying critical descriptors for the final SVR model. d Performance of the final SVR model for reactivity prediction. e Machine learning predictions for

external examples and experimental verification. Reaction conditions: substrates (0.2 mmol), **1c**, **1b** or **1d** (1.5 equiv.), KO'Bu (1.5 equiv.) in 1.0 mL of THF at 80 °C, 2.5 h, under Ar. ^aYield determined by ¹H NMR. The numbers labeled on the arenes are the calculated pK_a values of the related C–H bonds. (Pred.: Predicted yield; Exp.: Experimental yield).

enantioenriched chiral substrate (*R*)-1b leads to the formation of 1b' with complete loss of chirality (see Supplementary Fig. 19 for details). These experiments confirm that the elementary debromination step inherently involves a free carbanion-mediated pathway.

In a final effort to establish the generality of in situ superbase generation strategy, we turned our attention to the anionic polymerization of styrene, another significant application of organometallic reagents (Fig. 5d and see Supplementary Fig. 23 for the characterization of polymers). Employing a 20 mol% mixture of 1c/KO'Bu as the initiator, 4-chlorostyrene was polymerized to yield polystyrene 66 (*M*n: 22.9 kDa; polydispersity index, PDI: 2.51) in 63% yield. More importantly, the molecular weight of the resulting polymerization can be readily controlled by varying the amount of initiator. Reducing the amount of initiator to 10 mol% and 5 mol% led to a significant increase in the number-average molecular weight (*M*n) of polystyrenes, from 22.9 kDa to 98.1 and 166.7 kDa, respectively. This

in situ generated superbase approach is expected to provide a new strategy for the controlled polymerization of styrene.

Discussion

The results presented here demonstrate that the superbase reactivity of classical organometallic reagents can be readily achieved through the use of stable benzylic or allylic boronates in combination with alkali-metal alkoxides. This provides a unique tool for the construction of C(sp²)–B bonds, proceeding through either regioselective C–H deprotonation or metal-halogen exchange mechanistic scenarios. The diverse structures of boronates facilitate the fine selection of substrate combinations. This method is also applicable to the controlled polymerization of styrene. This in situ-generated carbanions strategy overcomes the synthetic and storage issues associated with traditional organometallic reagents. We believe the diverse reactivity of this method will likely be of great utility to the fields of organic synthesis

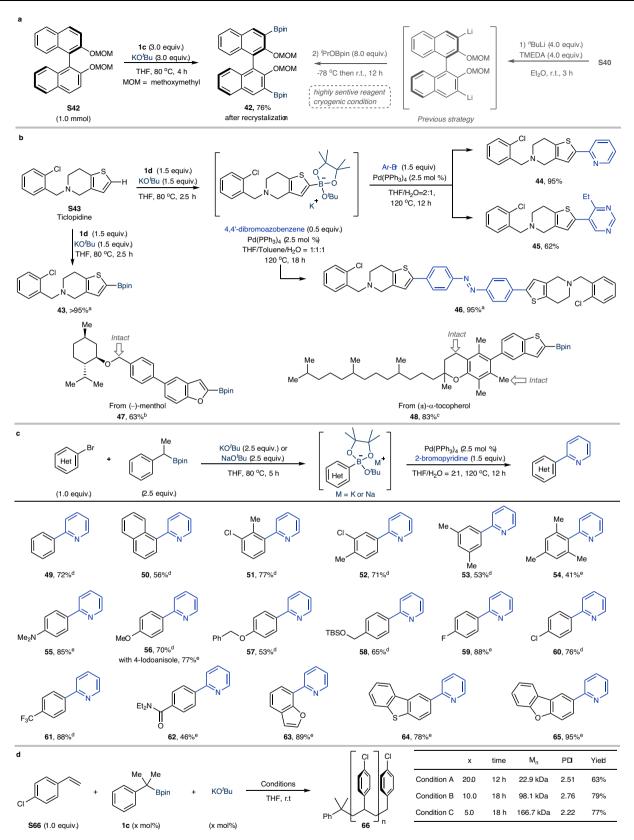


Fig. 5 \mid Application of the (hetero)arenes C(sp²)–H borylation and scope extension to borylation of aryl bromides and anionic polymerization.

a Borylation of methoxylmethyl (MOM)-protected (R)-BINOL and a comparison to the previous strategy. **b** Cascade C(sp²)-H borylation/Suzuki-Miyaura cross-coupling for the structural diversification of drug-relevant substrates. **c** Cascade borylation of aryl bromides/Suzuki-Miyaura cross-coupling for the synthesis of

biaryls. **d** Benzylic boronate/KO'Bu combination-initiated polymerization of 4-chlorostyrene under different conditions. $^{\rm a}$ Without further purification by column chromatography on silica gel. $^{\rm b}$ **S47** (0.2 mmol), **1d** (1.1 equiv) and KO'Bu (1.5 equiv) in 1.0 mL of THF at 40 °C, 5 h, under Ar. '**S48** (0.1 mmol), **1d** (1.5 equiv) and KO'Bu (1.5 equiv) in 1.0 mL of THF at 60 °C, 5 h, under Ar. $^{\rm c}$ With KO'Bu. °With NaO'Bu.

and medicinal chemistry, and that the practicality of the borylation reaction will lead to broader synthetic applications, especially through the use of tandem processes.

Methods

General procedure for C–H borylation reaction of (hetero)arenes for the synthesis of arylboronates

In an argon-filled glovebox, bases (0.15 mmol ~ 0.3 mmol, 1.5 equiv. ~ 3.0 equiv.), boron sources **1c** or **1d** (0.15 mmol ~ 0.3 mmol, 1.5 equiv. ~ 3.0 equiv.) and THF (0.5 ~ 1.0 mL) were added to an oven-dried 10 mL Schlenk tube equipped with a magnetic stir bar. The resulting mixture was pre-stirred at ambient temperature for 10 min, and then the corresponding (hetero)arenes (0.1 mmol ~ 0.2 mmol, 1.0 equiv.) were added into the reaction mixture. The reaction tube was sealed, removed from the glovebox and stirred at the indicated temperature for 2.5 ~ 5 h. After the reaction finished, saturated NH₄Cl solution (3 mL) and saturated brine (1.0 mL) were added to the reaction mixture, and the organic phase was separated. The aqueous phase was extracted with diethyl ether (3 × 3 mL). Then, the organic phases were combined, dried over anhydrous Na₂SO₄, and filtered. After the removal of the solvent under reduced pressure, the crude material was purified by flash column chromatography on silica gel or preparative thin-layer chromatography to afford the corresponding borylation products.

General procedure for cascade C-H borylation/hydroxylation of aryl ether for the synthesis of phenol derivatives

Step 1. C–H borylation. In an argon-filled glovebox, KO⁶Bu (3.0 mmol $^{\circ}$ 6.0 mmol, 1.5 equiv. $^{\circ}$ 3.0 equiv.), **1c** (3.0 mmol $^{\circ}$ 6.0 mmol, 1.5 equiv. $^{\circ}$ 3.0 equiv.) and THF (0.5 $^{\circ}$ 1.0 mL) were added to an oven-dried 10 mL Schlenk tube equipped with a magnetic stir bar. The resulting mixture was pre-stirred at ambient temperature for 10 min, and then the corresponding aryl ethers (0.2 mmol, 1.0 equiv.) were added to the reaction mixture. The reaction tube was sealed, removed from the glovebox and stirred at 80 °C for 2.5 h.

Step 2. Then, C-B hydroxylation. After the reaction finished, the reaction mixture was cooled to room temperature, and NaBO $_3$ ·4H $_2$ O (0.6 mmol ~1.2 mmol, 3.0 ~6.0 equiv.) and H $_2$ O (1.0 mL) were added into the reaction mixture. The mixture was stirred for an additional 3 h at room temperature. Then, saturated NH $_4$ Cl solution (3 mL) and saturated brine (1.0 mL) were added to the reaction mixture, and the organic phase was separated. The aqueous layer was extracted with ethyl acetate (3 × 3 mL). Then, the organic layers were combined, dried over anhydrous Na $_2$ SO $_4$, and filtered. After the removal of the solvent under reduced pressure, the crude material was purified by preparative thin-layer chromatography to afford the corresponding phenol derivatives.

General procedures for cascade borylation of aryl bromides/ Suzuki-Miyaura cross-coupling for the synthesis of biaryl products

Step 1. Debromoborylation. In an argon-filled glovebox, KO 6 Bu (56.0 mg, 0.5 mmol, 2.5 equiv.) or NaO 6 Bu (48.0 mg, 0.5 mmol, 2.5 equiv.), methyl benzylic boronate **1b** (116.0 mg, 0.5 mmol, 2.5 equiv.) and THF (1.0 mL) were added to an oven-dried 10 mL Schlenk tube equipped with a magnetic stir bar. The resulting mixture was prestirred at ambient temperature for 10 min, then aryl bromides (0.2 mmol, 1.0 equiv.) were directly added to the reaction mixture. The reaction tube was sealed and stirred at 80 $^\circ$ C for 5 h.

Step 2. Suzuki-Miyaura cross-coupling. After the borylation process finished, Pd(PPh₃)₄ (5.8 mg, 0.05 mmol, 0.025 equiv.), 2-bromopyridine (47.4 mg, 0.3 mmol, 1.5 equiv.) and degassed water (0.5 mL) were added to the reaction mixture. The reaction tube was sealed, removed from the glovebox and stirred at 120 °C for 12 h.

After the reaction finished, saturated NH_4Cl solution (3 mL) and saturated brine (1.0 mL) were added to the reaction mixture, and the organic phase was separated. The aqueous layer was extracted with ethyl acetate (3 × 3 mL). Then, the organic layers were combined, dried over anhydrous Na_2SO_4 , and filtered. After the removal of the solvent under reduced pressure, the crude material was purified by preparative thin-layer chromatography to afford the corresponding biaryl products.

Data availability

The authors declare that all other data supporting the findings of this study are available within the article and Supplementary Information files, and are also available from the corresponding authors upon request. The X-ray crystallographic structure data generated in this study have been deposited in the Cambridge Crystallographic Data Center (CCDC) database under accession code 2443058 (23) and 2443061 (24), and can be obtained free of charge via https://www.ccdc.cam.ac.uk/structures/. The final dataset for yield prediction model labeled as Data-round-ML and the cartesian coordinates of DFT-calculated geometries labeled as xyz-coordinates in this study are provided in the Source Data file. Source data are provided with this paper.

Code availability

The source codes generated during the current study are available at https://github.com/Daojing-Li/Stable-Organoboronates-ML-Supp.

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Author contributions

X.L., G.W. and S.L. conceived the work and designed the computational and experimental investigations. X.L. carried out most of the

experiments with the help of M.W., S.Y., M.Y., S.C., Z.L., and L.G. X.L. also performed quantum-chemical calculations, with G.L. specifically assisting in the reaction network construction for key intermediate substrates. D.L. performed the machine learning model construction, with M.W. and L.H. assisting in dataset construction. X.L., G.W., and S.L. discussed the results and co-wrote the paper with the input from all the other authors. G.W. and S.L. supervised the project.

Competing interests

The authors declare no competing interests.

Additional information

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