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Supporting Information

Automated Quantum Chemistry for Estimating Nucleophilicity and Electrophilicity with Applications to Retrosynthesis and Covalent Inhibitors Nicolai Ree,[†] Andreas H. Göller,^{*,‡} and Jan H. Jensen^{*,†}

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Overview of the QM-based workflow:



Figure S1: Flowchart describing the automated QM-based workflow for identifying possible nucleophilic and electrophilic sites and computing methyl cation affinities (MCAs) and methyl anion affinities (MAAs) to quantify nucleophilicity and electrophilicity, respectively. An example of the visual output can be seen in Figure S3.



Results of QM-based workflow w/o DFT single-point calculations:

Figure S2: Correlation plots between (a) experimental Mayr's $N \cdot s_N$ and calculated MCAs, (b) experimental Mayr's E and calculated MAAs, (c) calculated MCAs at different levels of theory, and (d) calculated MAAs at different levels of theory. Calculations on the x- and y-axes are performed at the GFN1-xTB ALPB(DMSO) and PBE0-D3(BJ)/DEF2-TZVP COSMO(∞) level of theory, respectively. The black regression lines consider all points, whereas the blue regression line omits compound mca27 (cyanide: [C-]#N).

Chemical selectivity predictions for Raltegravir:

	SMILES: Cc1nnc(C(=O)Cl)o1.Cn1c(C(C)(C)N)nc(C(=O)NCc2ccc(F)cc2)c(O)c1=O										
$\begin{array}{c} 6\\ 0\\ -5\\ -5\\ -7\\ -1\\ -7\\ -1\\ -7\\ -1\\ -7\\ -1\\ -7\\ -1\\ -1\\ -1\\ -1\\ -1\\ -1\\ -1\\ -1\\ -1\\ -1$											
	Elect	rophilicity (MAA)		Nucleophilicity (MCA)							
Atom ID	MAA Value [kJ/mol]	Error Log (Reactant, Product)	Туре	Atom ID	MCA Value [kJ/mol]	Error Log (Reactant, Product)	Туре				
1.5	395.43	None, Connectivity	Acyl halide	2.2	497.70	None, Connectivity	Double bond				
2.16	305.65	None, Connectivity	Double bond	2.6	448.52	None, None	Amine				
1.1	288.53	None, None	Double bond	1.2	393.04	None, None	Pyridine like nitrogen				
			Double	2.14	384.33	None, Connectivity	Double bond				
1.4	211.75	<u>None, Connectivity</u>	bond	2.19	384.33	None, Connectivity	Double bond				
1.3	201.21	None, None	Double bond	1.3	375.43	None, None	Pyridine like nitrogen				
2.9	186.05	None, Connectivity	Amide	2.11	346.35	None, None	Atom with lone pair				
2.22	180.44	None, Connectivity	Double bond	2.23	343.20	None, None	Atom with lone pair				
2.20	156.85	<u>None, None</u>	Double bond	2.9	339.61	None, Connectivity	Double bond				

Figure S3: Chemical selectivity predictions in the synthesis of Raltegravir. Electrophilic and nucleophilic sites with MAAs and MCAs within 3 kcal/mol ≈ 12.6 kJ/mol are highlighted in blue and green, respectively. The MAAs and MCAs are obtained at the r²SCAN-3c SMD(DMSO)//GFN1-xTB ALPB(DMSO) level of theory. Atom site 2.2 has a connectivity failure for the MCA product corresponding to the $-C^+(CH_3)(CH_3)NH_2$ group being detached from the ring, as the CH_3^+ takes its position. Hence, atom site 2.6 is the most nucleophilic site.

2.2	151.45	<u>None, None</u>	Double bond	2.7	333.88	None, None	Pyridine like nitrogen
1.6	129.58	<u>None, None</u>	Double bond	2.21	329.96	None, Connectivity	Phenol
1.2	111.14	None, Connectivity	Double	2.10	323.50	None, None	Amide
			Double	2.15	299.03	<u>None, None</u>	Double bond
2.8	106.81	<u>None, None</u>	bond	2.18	299.03	None, None	Double bond
2.14	97.80	None, None	Double bond	2.13	293.56	None, None	Double bond
2.19	97.80	None. None	Double	2.22	289.71	None, Connectivity	Double bond
		, <u></u> _	bond	2.20	282.17	None, None	Double bond
2.15	76.75	<u>None</u> , <u>None</u>	Double bond	2.8	278.52	None, None	Double bond
2.18	76.75	None, None	Double bond	2.1	261.22	None, None	Atom with lone pair
2.13	60.26	None, None	Double bond	2.16	256.31	None, None	Double bond
2.23	0.64	None, None	Double bond	1.6	243.13	None, None	Atom with lone pair
			Double	1.4	233.88	None, None	Double bond
2.7	0.43	<u>None</u> , <u>None</u>	bond	1.1	179.15	None, None	Double bond
2.10	-9.56	<u>None, None</u>	Double bond	1.7	176.05	None, None	Atom with lone pair
				1.5	158.16	None, Connectivity	Double bond
				1.8	137.65	None, None	Ether
				2.17	130.80	None, None	Atom with lone pair

Figure S3: Continued.



Figure S4: Retrosynthetic route for synthesizing Raltegravir predicted by Manifold from PostEra.

	SMILES: COC(=O)c1nnc(C)o1.COC(=O)c1nc(C(C)(C)N)[nH]c(=O)c1O										
6 N 5 0^3 11 12 14 $0H$ 15 0^3 9 10 0^3 11 12 14 15 0^3 10 10 10 10 10 10 10 10											
	Electi	rophilicity (MAA)		Nucleophilicity (MCA)							
Atom ID	MAA Value [kJ/mol]	Error Log (Reactant, Product)	Туре	Atom ID	MCA Value [kJ/mol]	Error Log (Reactant, Product)	Туре				
2.2	241.87	None, Connectivity	Ester	2.10	478.44	None, None	Amine				
1.7	221.10	<u>None, None</u>	Double bond	2.6	466.93	None, Connectivity	Double bond				
2.14	203.06	None, None	Double bond	2.11	439.36	None, Connectivity	Atom with lone pair				
1.2	185.52	<u>None, None</u>	Ester	1.6	408.66	None, None	Pyridine like nitrogen				
1.4	167.41	None, None	Double bond	1.5	393.67	None, None	Pyridine like nitrogen				
2.6	159.37	<u>None, None</u>	Double bond	2.5	388.18	None, None	Pyridine like nitrogen				
2.12	151.88	None, None	Double bond	2.13	352.00	None, None	Atom with lone pair				
2.4	149.31	None, None	Double bond	2.3	310.55	None, None	Ester				

Figure S5: Calculated MAAs and MCAs for the first reaction step in the retrosynthetic route by Manifold (see Figure S4). The MAAs and MCAs are obtained at the r²SCAN-3c SMD(DMSO)//GFN1-xTB ALPB(DMSO) level of theory.

1.5	91.82	<u>None, None</u>	Double bond	2.15	301.03	None, Connectivity	Phenol
			Double	2.12	300.48	None, Connectivity	Double bond
2.13	28.99	<u>None, None</u>	bond	2.14	300.24	None, Connectivity	Double bond
1.3	26.07	None, None	Double bond	2.2	296.71	None, Connectivity	Double bond
2.3	12.72	None, None	Double	2.4	272.02	<u>None, None</u>	Double bond
			Double	1.3	271.56	<u>None, None</u>	Ester
2.5	-10.35	<u>None, None</u>	Double bond	1.2	268.66	None, Connectivity	Double bond
1.6	-27.10	<u>None, None</u>	Double bond	1.4	255.16	<u>None, None</u>	Double bond
				2.1	246.00	<u>None, None</u>	Atom with lone pair
				1.7	206.90	None, None	Double bond
				1.1	197.01	None, None	Atom with lone pair
				1.9	151.30	None, None	Ether

Figure S5: Continued.

	SMILES: COC(=O)c1nc(C(C)(C)NC(=O)c2nnc(C)o2)[nH]c(=O)c1O.CB(O)O										
	$ \begin{array}{c} 17 \\ 16 \\ 15 \\ 14 \\ 14 \\ 12 \\ 14 \\ 12 \\ 14 \\ 12 \\ 10 \\ 10 \\ 10 \\ 10 \\ 10 \\ 10 \\ 10$										
	Electr	ophilicity (MAA)		Nucleophilicity (MCA)							
Atom ID	MAA Value [kJ/mol]	Error Log (Reactant, Product)	Туре	Atom ID	MCA Value [kJ/mol]	Error Log (Reactant, Product)	Туре				
1.13	269.73	None, Connectivity	Double bond	1.15	428.03	None, None	Pyridine like nitrogen				
1.2	252.23	<u>None, Connectivity</u>	Ester	1 14	420.16	None None	Pyridine like				
1.16	233.52	None, None	Double bond	1.17		None, None	nitrogen				
1.22	212.39	None, None	Double	1.19	410.56	None, Connectivity	Atom with lone pair				
1.6	184.97	None, None	Double	1.5	375.44	<u>None, None</u>	Pyridine like nitrogen				
1 20	169 10	None None	Double	1.10	352.89	None, None	Atom with lone pair				
1.20	103.10	TAGHE, INCHE	bond	1.12	334.97	<u>None, None</u>	Amide				
1.4	158.20	<u>None, None</u>	Double bond	1.2	328.27	None, Connectivity	Double bond				

Figure S6: Calculated MAAs and MCAs for the second reaction step in the retrosynthetic route by Manifold (see Figure S4). The MAAs and MCAs are obtained at the r²SCAN-3c SMD(DMSO)//GFN1-xTB ALPB(DMSO) level of theory.

1.11	147.33	None, Connectivity	Amide	1.11	325.66	None, Connectivity	Double bond
1.14	105.53	None, None	Double bond	1.21	323.21	None, None	Atom with lone pair
1.12	62.28	None, None	Double bond	1.3	311.41	None, None	Ester
			Double	1.23	293.93	<u>None, Connectivity</u>	Phenol
1.21	41.41	<u>None, None</u>	bond	1.13	274.10	None, None	Double bond
1.3	26.83	None, None	Double bond	1.4	269.92	None, None	Double bond
1.15	9.55	None, None	Double bond	2.2	269.87	<u>None, None</u>	Atom with lone pair
1.5	-18.58	None, None	Double bond	2.3	269.87	None, None	Atom with lone pair
				1.20	264.93	None, Connectivity	Double bond
				1.22	262.63	None, None	Double bond
				1.6	254.13	None, Connectivity	Double bond
				1.1	247.26	<u>None, None</u>	Atom with lone pair
				1.16	241.09	None, None	Double bond
				1.18	181.68	<u>None, None</u>	Ether

Figure S6: Continued.

SMILES: NCc1ccc(F)cc1.COC(=O)c1nc(C(C)(C)NC(=O)c2nnc(C)o2)n(C)c(=O)c1O

H_2N 2 5 $F = 6$ 17 16 15 8 7 15	$ \begin{array}{c} & & & & & & \\ & & & & & \\ 6 \\ 5 \\ 5 \\ N \\ 14 \\ 12 \\ \end{array} \begin{array}{c} 20 \\ 19 \\ 19 \\ 19 \\ 19 \\ 19 \\ 10 \\ 10 \\ 1$
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	Electr	ophilicity (MAA)		Nucleophilicity (MCA)			
Atom ID	MAA Value [kJ/mol]	Error Log (Reactant, Product)	Туре	Atom ID	MCA Value [kJ/mol]	Error Log (Reactant, Product)	Туре
1.5	310.44	None, Connectivity	Double bond	1.0	488.97	None, None	Amine
2.2	222.56	None, Connectivity	Ester	2.15	411.26	None, None	Pyridine like nitrogen
2.21	196.20	None, Connectivity	Double bond	2.14	403.50	None, None	Pyridine like nitrogen
2.23	195.82	None, None	Double bond	1.2	400.10	None, Connectivity	Double bond
2.16	184.28	None, None	Double bond	2.22	329.57	None, None	Atom with lone pair
2.6	173.14	None, None	Double bond	2.5	326.60	None, None	Pyridine like nitrogen
2.13	161.22	None, None	Double bond	2.12	319.65	<u>None, None</u>	Amide
			Doublo	1.5	317.49	<u>None, Connectivity</u>	Double bond
2.4	138.50	<u>None, None</u>	bond	1.7	314.44	<u>None, None</u>	Double bond

Figure S7: Calculated MAAs and MCAs for the third reaction step in the retrosynthetic route by Manifold (see Figure S4). The MAAs and MCAs are obtained at the r²SCAN-3c SMD(DMSO)//GFN1-xTB ALPB(DMSO) level of theory.

2.11	110.08	<u>None</u> , <u>None</u>	Amide	1.4	314.44	<u>None, None</u>	Double bond
1.8	82.22	<u>None</u> , <u>None</u>	Double bond	2.10	304.59	None, None	Atom with lone pair
1.3	82.22	<u>None</u> , <u>None</u>	Double bond	1.3	303.20	None, None	Double bond
1.4	71.43	None, None	Double bond	1.8	303.20	<u>None, None</u>	Double bond
				2.3	298.20	<u>None, None</u>	Ester
1.7	71.43	None, None	Double bond	2.21	289.68	None, Connectivity	Double bond
1.2	55.35	None, None	Double bond	2.2	285.58	None, <u>Connectivity</u>	Double bond
2.14	42.93	None, None	Double	2.23	272.59	<u>None, Connectivity</u>	Double bond
		bonu	2.13	270.05	None, None	Double bond	
2.22	24.46	None, None	Double bond	2.24	268.37	None, Connectivity	Phenol
2.5	10.16	None, None	Double bond	2.4	256.98	<u>None, None</u>	Double bond
				2.11	242.67	None, Connectivity	Double bond
2.12	4.25	<u>None, None</u>	bond	2.6	240.50	None, Connectivity	Double bond
2.15	-3.30	None, None	Double bond	2.1	239.26	None, None	Atom with lone pair
2.3	-4.51	None, None	Double bond	2.19	229.57	None, None	Atom with lone pair
				2.16	225.10	None, None	Double bond
				2.18	150.97	<u>None, None</u>	Ether
				1.6	143.47	None, None	Atom with lone pair

Figure S7: Continued.



Figure S8: Predicted pKa values for the first reactant in the second reaction step of the retrosynthetic route by Manifold (see Figure S4). The predicted pKa values are obtained using MarvinSketch.

	SMILES: COC(=O)c2nc(C(C)(C)NC(=O)c1nnc(C)o1)[n-]c(=O)c2O.CB(O)O											
	17 16 151	$ \begin{array}{c} 18 \\ 0 \\ 13 \\ 13 \\ 14 \\ 12 \end{array} \begin{array}{c} 9 \\ 19 \\ 19 \\ 19 \\ 19 \\ 19 \\ 19 \\ 19 \\ $	20 22 22 22 22 22 22 23 4 23 4 20 3 10 0	2 HO	1 B 0 3	0 H						
	Electi	rophilicity (MAA)		Nucleophilicity (MCA)								
Atom ID	MAA Value [kJ/mol]	Error Log (Reactant, Product)	Туре	Atom ID	MCA Value [kJ/mol]	Error Log (Reactant, Product)	Туре					
1.16	182.48	None, None	Double bond	1.19	489.36	None, None	Nitranion					
1.2	177.30	None, Connectivity	Ester	1.21	454.13	None, None	Atom with lone pair					
1.13	154.50	None, None	Double bond	1.10	449.73	None, Connectivity	Atom with lone pair					
1.22	127.95	None, None	Double bond	1.5	441.35	None, None	Pyridine like nitrogen					
1.11	105.30	<u>None, None</u>	Amide	1 1 5	410.64	None None	Pyridine like					
1.4	51.53	None, None	Double bond	1.15	418.04	<u>inone, inone</u>	nitrogen					
1.14	44.53	None, None	Double	1.14	416.15	<u>None, None</u>	Pyridine like nitrogen					
				1.13	395.25	None, Connectivity	Double bond					
1.6	37.56	None, None	Double bond	1.22	376.07	None, None	Double bond					

Figure S9: Calculated MAAs and MCAs for the second reaction step in the retrosynthetic route by Manifold (see Figure S4). The atom site 1.19 is deprotonated compared to Figure S6. The MAAs and MCAs are obtained at the $r^2SCAN-3c SMD(DMSO)//GFN1-xTB ALPB(DMSO)$ level of theory.

1.20	34.50	<u>None, None</u>	Double 1 bond	1.20	373.46	None, Connectivity	Double bond
			Double	1.6	367.10	None, Connectivity	Double bond
1.12	-0.97	<u>None, None</u>	bond	1.2	351.21	None, Connectivity	Double bond
1.21	-52.24	<u>None, None</u>	Double bond	1.12	338.39	None, None	Amide
1.15	-61.24	<u>None, None</u>	Double	1.3	331.36	None, None	Ester
			Double -	1.4	322.81	None, None	Double bond
1.5	-61.74	<u>None, None</u>	Double bond	1.23	317.60	None, Connectivity	Phenol
1.3	-66.73	<u>None, None</u>	Double bond	1.1	274.86	None, None	Atom with lone pair
				2.2	269.87	<u>None, None</u>	Atom with lone pair
				2.3	269.87	<u>None</u> , <u>None</u>	Atom with lone pair
				1.16	262.42	None, None	Double bond
				1.11	190.58	None, Connectivity	Double bond
				1.18	174.49	<u>None, None</u>	Ether

Figure S9: Continued.

	SMILES: COC(=0)c1nc(C(C)(C)NC(=0)c2nnc(C)o2)[nH]c(=0)c1[0-].CB(0)0											
$\begin{array}{c} 17 \\ 16 \\ 15 \\ 14 \\ 12 \\ 14 \\ 12 \\ 10 \\ 14 \\ 12 \\ 10 \\ 10 \\ 10 \\ 10 \\ 10 \\ 10 \\ 10$					1 B 0 3	0 H						
	Electro	ophilicity (MAA)			Nuc	leophilicity (MCA)						
Atom ID	MAA Value [kJ/mol]	Error Log (Reactant, Product)	Туре	Atom ID	MCA Value [kJ/mol]	Error Log (Reactant, Product)	Туре					
1.16	206.88	None, None	Double bond	1.4	477.67	None, None	Enolate					
1.13	204.55	None, Connectivity	Double bond	1.2	465.47	None, Connectivity	Double bond					
1.11	151.79	None, None	Amide	1.10	439.38	None, Connectivity	Atom with lone pair					
1.20	143.14	None, Connectivity	Double bond	1.23	436.31	<u>None, None</u>	Anion with charge minus1					
1.2	81.86	None, None	Ester	1.5	424.93	<u>None, None</u>	Pyridine like nitrogen					
1.14	71.36	<u>None, None</u>	Double bond	1.22	419.49	None, Connectivity	Double bond					

Figure S10: Calculated MAAs and MCAs for the second reaction step in the retrosynthetic route by Manifold (see Figure S4). The atom site 1.23 is deprotonated compared to Figure S6. The MAAs and MCAs are obtained at the r²SCAN-3c SMD(DMSO)//GFN1-xTB ALPB(DMSO) level of theory.

1.22	53.00	<u>None, None</u>	Double bond	1.15	418.47	None, None	Pyridine like nitrogen
1.6	50.60	<u>None, None</u>	Double bond	1.6	415.25	None, None	Double bond
1.4	34.98	<u>None, None</u>	Double bond	1.14	409.38	<u>None, None</u>	Pyridine like nitrogen
1.12	14.93	None, None	Double bond	1.21	388.73	None, None	Atom with lone pair
1.15	-17.13	None, Connectivity	Double bond	1.3	381.45	None, None	Ester
				1.20	349.43	None, Connectivity	Double bond
1.5	-45.17	None, None	Double bond	1.12	335.83	None, None	Amide
1.21	-77.24	<u>None, None</u>	Double bond	1.1	332.79	<u>None</u> , <u>None</u>	Atom with lone pair
1.3	-108.39	<u>None, None</u>	Double bond	1.13	317.89	None, None	Double bond
				1.19	309.30	<u>None, None</u>	Atom with lone pair
				1.16	280.77	None, None	Double bond
				2.2	269.86	<u>None, None</u>	Atom with lone pair
				2.3	269.86	<u>None, None</u>	Atom with lone pair
				1.11	218.05	None, Connectivity	Double bond
				1.18	174.46	None, None	Ether

Figure S10: Continued.





Figure S11: Covalent inhibitor reactivity prediction for 9 different propargy lamides. The calculated MAAs are obtained at the r²SCAN-3c SMD (DMSO)//GFN1-xTB ALPB (DMSO) level of theory and otherwise ω B97XD/cc-pVDZ CPCM (H₂O). The blue regression lines are defined in the main text. The red dots are considered outliers in the work of Hermann et al.¹³



Figure S12: Covalent inhibitor reactivity prediction for various acrylamides (top), propargylamides (middle), and 2-chloroacetamides (bottom). The calculated MAAs (left) and relative methanethiolate affinities (MAs) (right) are obtained at the r²SCAN-3c SMD(DMSO)//GFN1-xTB ALPB(DMSO) level of theory. The black regression lines consider all points, whereas the blue regression lines are defined in the main text. The red dots are considered outliers in the work of Hermann et al.¹³