Supporting Information for:

## Efficient construction of atomic-resolution models of non-sulfated chondroitin glycosaminoglycan using molecular dynamics data

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**Table S1.** Comparison to Observed Literature Values of Glycosidic Linkage Dihedrals ( $\phi$ ,  $\psi$ ) in Non-Sulfated Chondroitin

		GlcAβ1-3GalNAc				GalNAcβ1-4GlcA			
	Min	φ	Diff	Ý	Diff <sup>1</sup>	φ	Diff	Ψ	Diff <sup>2</sup>
Biased MD-generated 2-mer Ensembles [1] <sup>3</sup>	Ι	-83.75°	+2.5°	83.75°	+122.5°	-63.75°	-2.5°	-121.25°	-122.5°
	II					-58.75°	0°	93.75°	-127.5°
	II′					-83.75°	-2.5°	48.75°	-122.5°
Unbiased MD-Generated and NMR-Validated 6-mer Ensembles [2] <sup>4</sup>	I	-72°	-9°	108°	+98°	-73°	+7°	-117°	-127°

Diff =  $(x_{(obs)} - x) + -360^{\circ}$  where  $x_{(obs)} = \phi$  or  $\psi$  observed in our 20-mer simulations

<sup>1</sup> Expected difference for  $\beta$ 1-3 = +120°

<sup>2</sup> Expected difference for  $\beta$ 1-4 = -120°

<sup>3</sup>  $\phi$ ,  $\psi$  dihedral angles were sorted into 2.5° bins.

 $^{4} \phi$ ,  $\psi$  dihedral angles were sorted into 1° bins; only global minima (I) were reported.

Piercing Bond	Pierced Ring	Pierce Type <sup>1</sup>	Eь (kcal/mol)	$\Delta E_b = E_b - E_{b,cut}^2$ (kcal/mol)	Estimated ΔE <sub>b</sub> <sup>3</sup> (kcal/mol)	
GalNAc C5-C6	GalNAc	Exocyclic	721.0	592.2	285.2	
GalNAc C6-O6	GalNAc	Exocyclic	784.2	655.4	132.3	
GalNAc C6-O6	GalNAc	Exocyclic	793.0	664.2	132.3	
GalNAc C-CT	GlcA	Exocyclic	787.7	658.9	253.4	
GlcA C5-C6	GlcA	Exocyclic	720.2	591.4	294.6	
GalNAc C <sub>3</sub> -O <sub>3</sub>	GlcA	Linkage	715.8	587.0	224.1	
GlcA C4-O4	GalNAc	Linkage	714.8	586.0	238.6	
GlcA	GalNAc	Interlocking	981.2	852.4	725.2	
GlcA	GalNAc	Interlocking	941.6	812.8	725.2	
GlcA	GlcA	Interlocking	961.4	832.6	723.7	
GalNAc	GalNAc	Interlocking	1053	924.2	520.3	
GalNAc	GalNAc	Interlocking	1110	981.2	520.3	

Table S2. Bond Energies (Eb) of Constructed Chondroitin 20-mer Conformations with Pierced Rings

<sup>1</sup> <u>Exocyclic</u>: the piercing bond is an exocyclic bond not participating in a glycosidic linkage; <u>Linkage</u>: the piercing bond is part of a glycosidic linkage; <u>Interlocking</u>: the rings are interlocking (i.e. there are two piercing bonds and the estimated  $\Delta E_b$  is the sum of the estimated  $\Delta E_b$  of these two bonds).

<sup>2</sup> *E*<sub>b,cut</sub> = 128.85 kcal/mol (bond energy cutoff).

<sup>3</sup> Bond strain energy of this piercing bond estimated by comparing this bond energy in individual nonbonded saccharide systems with and without ring piercing.



**Figure S1.** End-to-end distance probability distribution of 20-mer ensembles generated by MD (blue dashed lines) and an early version of the construction algorithm (red solid lines) which applied glycosidic linkage geometries from MD-generated 20-mer ensembles and standard force field geometries for all monosaccharide rings; each type of ensemble includes four sets of 10,000 conformations; probabilities were calculated for end-to-end distances sorted into 0.5 Å bins.



**Figure S2.** Scatterplots of radius of gyration as a function of end-to-end distance in MD-generated and constructed ensembles of non-sulfated chondroitin (a,b) 20-mer and (c,d) 10-mer, respectively, and constructed ensembles of the chondroitin (e) 100-mer and (f) 200-mer. Each plot has 40,000 samples and shows linear regression and R<sup>2</sup>.





**Figure S3.**  $\Delta G(\phi, \psi)$  plots for each glycosidic linkage in the chondroitin 20-mer from MD-generated ensembles; (a) GlcA2←GalNAc1, (b) GalNAc3←GlcA2, (c) GlcA4←GalNAc3, (d) GalNAc5←GlcA4, (e) GlcA6←GalNAc5, (f) GalNAc7←GlcA6, (g) GlcA8←GalNAc7, (h) GalNAc9←GlcA8, (i) GlcA10←GalNAc9, (j) GalNAc11←GlcA10, (k) GlcA12←GalNAc11, (l) GalNAc13←GlcA12, (m) GlcA14←GalNAc13, (n) GalNAc15←GlcA14, (o) GlcA16←GalNAc15, (p) GalNAc17←GlcA16, (q) GlcA18←GalNAc17, (r) GalNAc19←GlcA18, and (s) GlcA20←GalNAc19; monosaccharides are numbered from reducing to non-reducing end;  $\phi$ ,  $\psi$  separated into 2.5° bins.







**Figure S4.** (a-t) Cremer-Pople plots for each monosaccharide ring in the chondroitin 20-mer from MD-generated ensembles; monosaccharides are numbered from reducing to non-reducing end; each of the 4 runs is represented by different color.



**Figure S5.** (**a-i**) Probability histograms of bond lengths for each type of bond in the chondroitin 20-mer; blue lines represent bond lengths in MD-generated ensembles (which match those in constructed ensembles before minimization) and red lines represent bond lengths in constructed 20-mer ensembles after minimization. (Note: bond lengths involving hydrogen atoms (**g-i**) are fixed during MD but not during minimization in the algorithm.)



**Figure S6.** Probability histogram showing changes in glycosidic linkage  $\phi$  and  $\psi$  dihedral angles during energy minimization in constructed 20-mer ensembles; 99.6% of all differences are within 4°.



**Figure S7.** Cremer-Pople plots of (**a**) GalNAc and (**b**) GlcA in MD-generated chondroitin 10-mer ensembles; geometries from the four sets of each type of ensemble are represented by red, green, blue, and magenta dots, respectively and the force field geometry is represented by a black dot. Cremer-Pople parameters of all rings in every tenth snapshot from each ensemble were plotted (i.e. 5 rings \* 1,000 snapshots per run \* 4 runs = 20,000 parameter sets).



**Figure S8.** End-to-end distance probability distribution of chondroitin 20-mer ensembles generated by MD (blue dashed lines) and an early version of the construction algorithm (red solid lines) which applied glycosidic linkage geometries from Adaptive Biasing Force (ABF) [3,4] MD-generated ensembles of non-sulfated chondroitin disaccharides [1] and standard force field geometries for all monosaccharide rings; each type of ensemble includes four sets of 10,000 conformations; probabilities were calculated for end-to-end distances sorted into 0.5 Å bins.



**Figure S9.**  $\Delta G(\phi, \psi)$  plots for GlcAβ1-3GalNAc and GalNAcβ1-4GlcA glycosidic linkages in (**a**,**b**) nonsulfated chondroitin disaccharides simulated using MD with ABF on glycosidic linkage dihedrals ( $\phi$ ,  $\psi$ separated into 1° bins) and (**c**,**d**) 20-mer ensembles constructed using glycosidic linkage dihedral probabilities from ABF MD-generated disaccharides and standard force-field monosaccharide ring geometries ( $\phi$ ,  $\psi$  separated into 2.5° bins); contour lines every 1 kcal/mol; in ABF MD simulations, all values of  $\phi$ ,  $\psi$  were sampled but contours for data with  $\Delta G(\phi, \psi) > 7$  kcal/mol are given values of 7 kcal/mol in plots (**a**,**b**) for clarity (shown in red).





**Figure S10.** Bond energy distribution probability histograms from constructed ensembles of the (**a**) 10-mer (cutoff = 115.49 kcal/mol), (**b**) 20-mer (cutoff = 128.85 kcal/mol), (**c**) 100-mer (cutoff = 274.89 kcal/mol), and (**d**) 200-mer (cutoff = 449.26 kcal/mol).



**Figure S11.** Average bond energies, standard deviations (calculated by fitting energies to gaussian curve), and regression line as a function of polymer length. Of note, (1) the regression equation calculated using only 10-mer and 20-mer constructed data:  $E_b = 1.383n + 0.028$  (regression line plotted) closely matches (2) the regression equation calculated using 10-, 20-, 100-, and 200-mer constructed data:  $E_b = 1.391n - 0.139$ . Average bond energies of the 100-mer and 200-mer predicted by regression equation (1),  $E_{b,predicted}(100) = 138.3$  kcal/mol and  $E_{b,predicted}(200) = 276.6$  kcal/mol, are within 2 kcal/mol of the true averages,  $E_b(100) = 138.8$  kcal/mol and  $E_b(200) = 278.2$  kcal/mol.

## References

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