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

|                                                                                         |              | GlcA <sub>B1</sub> -3GalNAc |              |               |                   | GalNAc <sub>B1</sub> -4GlcA |                |                   |                   |
|-----------------------------------------------------------------------------------------|--------------|-----------------------------|--------------|---------------|-------------------|-----------------------------|----------------|-------------------|-------------------|
|                                                                                         | Min          | Ø                           | Diff         | W             | Diff <sup>1</sup> | Ф                           | Diff           | W                 | Diff <sup>2</sup> |
| <b>Biased MD-generated</b><br>2-mer Ensembles [1] 3                                     |              | $-83.75^{\circ}$            | $+2.5^\circ$ | $83.75^\circ$ | $+122.5^{\circ}$  | $-63.75^{\circ}$            | $-2.5^{\circ}$ | $-121.25^{\circ}$ | $-122.5^{\circ}$  |
|                                                                                         | $\mathbf{I}$ |                             |              |               |                   | $-58.75^{\circ}$            | $0^{\circ}$    | $93.75^{\circ}$   | $-127.5^{\circ}$  |
|                                                                                         | II'          |                             |              |               |                   | $-83.75^{\circ}$            | $-2.5^{\circ}$ | $48.75^\circ$     | $-122.5^{\circ}$  |
| <b>Unbiased MD-Generated</b><br>and NMR-Validated<br>6-mer Ensembles $[2]$ <sup>4</sup> |              | $-72^\circ$                 | $-9^\circ$   | $108^\circ$   | $+98^\circ$       | $-73^\circ$                 | $+7^\circ$     | $-117°$           | $-127^{\circ}$    |

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

<sup>1</sup> Expected difference for  $β1-3 = +120°$ 

<sup>2</sup> Expected difference for  $β1-4 = -120°$ 

<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.

| <b>Piercing Bond</b> | <b>Pierced Ring</b> | Pierce Type <sup>1</sup> | Eь<br>(kcal/mol) | $\Delta E_{\rm b} = E_{\rm b} - E_{\rm b, cut}^2$<br>(kcal/mol) | Estimated $\Delta E$ <sup>3</sup><br>(kcal/mol) |  |
|----------------------|---------------------|--------------------------|------------------|-----------------------------------------------------------------|-------------------------------------------------|--|
| $GalNAcC5-C6$        | GalNAc              | Exocyclic                | 721.0            | 592.2                                                           | 285.2                                           |  |
| GalNAc $C_6$ - $O_6$ | GalNAc              | Exocyclic                | 784.2            | 655.4                                                           | 132.3                                           |  |
| GalNAc $C_6$ - $O_6$ | 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                                           |  |
| $GalNAcC3-O3$        | 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 (*E*b) of Constructed Chondroitin 20-mer Conformations with Pierced Rings

 $1$  Exocyclic: the piercing bond is an exocyclic bond not participating in a glycosidic linkage; Linkage: the piercing bond is part of a glycosidic linkage; Interlocking: 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*b,cut = 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 nonreducing 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 MDgenerated 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) [\[3](#page-17-2)[,4\]](#page-17-3) MD-generated ensembles of nonsulfated chondroitin disaccharides [\[1\]](#page-17-0) 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-toend distances sorted into 0.5 Å bins.



**Figure S9.** *G*(,) 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  $\phi$ , w 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*<sup>b</sup> = 1.383*n* + 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), *Eb*,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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