## The Geometry of Niggli Reduction: BGAOL, Embedding Niggli Reduction and Analysis of Boundaries

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## 1. Supplementary Materials – The Monte Carlo Search for Boundary Polytopes

One can follow an entirely algebraic process to identify all boundary polytopes. In view of the complexity of the space it is helpful to use a computer to explore N especially to confirm information on the dimensionality of boundary polytopes and on the necessary boundary transformations.

In order to reduce the computational burden and deal with the open boundary polytopes, rather than randomly generating points in  $G^6$ , we generate random short lines in  $G^6$  and look for cases in which the boundary of N must have been crossed because one end of the line is Niggli-reduced, while the other end is not. The process for the initial search for 5-D boundary polytopes is given in Table 1.

The search for the boundary polytopes resulting from the process in Table 1 produces transformations in the course of Niggli reduction (step 6). We sort the Niggli-reduced  $G^6$  vectors by the associated transformation matrix from step 6. A high population for a given matrix indicates a significant volume of  $G^6$  with access to the

associated boundary polytope, implying a 5-D boundary polytope (See Fig. 1 and Fig. 2). A lower population for a given matrix possibly implies a lower-dimensional boundary polytope, a common "edge" resulting from the intersection of multiple 5-D boundary polytopes. With enough probes, many of the lower dimensional boundary polytopes can be discovered, but only with difficulty because the information on those lower-dimensional boundary polytopes is swamped in a sea of data about the 5-D boundary polytopes.

Efficient discovery of all these intersections of multiple 5-D boundary polytopes requires the use of "projectors". A projector for a subspace Q in  $G^6$  is a symmetric matrix, P, that when applied to any point g in  $G^6$  is such that Pg is the closest point in Q to g. A projector has the nice property that PP = P, i.e. that it acts like the identity matrix on the subspace Q.

The projector for a given boundary polytope can be discovered by examining the set of Niggli-reduced  $G^6$  vectors associated with the transform matrix for that boundary polytope. The examination can either be a simple inspection of the list of vectors or can be done algorithmically by use of a singular value decomposition (SVD) calculation (Beltrami, 1873; Jordan, 1874; Stewart, 1993). It should be noted that the projector projects onto the hyperplane associated with the polytope and may project a point from  $G^6$ , or even from N itself, outside of N.

Let us first derive projectors by simple inspection. A search for points near a boundary produces a list of vectors that can be examined for the conditions that are met. For instance, the trial vectors:

```
4.41605
         53.21164
                     53.3171
                                 -9.85206
                                            -2.73956
                                                      -1.78806
         106.2402
                     106.5968
                                 -72.3608
                                            -0.26549
                                                      -4.79911
4.95245
5.62821
         98.26772
                     98.36612
                                 24.37056
                                            1.57819
                                                      1.85157
```

are seen to meet the condition  $g_2 = g_3$ .

The trial vectors:

4.85822	9.79018	40.14963	-3.6758	-0.01092	-2.18456
4.89205	21.22063	75.92303	6.01777	0.05752	2.78514
5.03365	26.32789	46.84058	-17.2646	-0.01252	-2.03757

are seen to meet the condition  $g_5 = 0$ .

In each case the necessary projector is obvious (see projectors  $P_2$  and  $P_3$ , below). In other cases, such as the body-diagonal boundary polytope, or many of the lower-dimensional boundary polytopes involving multiple face-diagonals, simple inspection is challenging. Given a sufficient number of vectors, the projector may be recovered algorithmically from such a list of vectors, rather than by inspection. If a singular value decomposition is done on a list of vectors near to and covering a single 5-D boundary polytope, the vector corresponding to the smallest singular value is the unit normal to that boundary polytope, and the projector onto that polytope is simply the identity minus the projector onto the line of the unit normal. The projector onto the line of the unit normal is generated by forming a matrix, A, whose first row is the unit normal and whose remaining rows are set to zero. Then  $A^TA$  is the projector onto the line of that unit normal.

In the general case of a lower-dimensional boundary polytope, the projector onto the boundary polytope is the identity minus the projector Q onto the hyperplane  $\Omega$  orthogonal to the boundary polytope. In that case a singular value decomposition on the list of vectors near to and covering the lower-dimensional boundary polytope will have small singular values for the vectors spanning  $\Omega$ . The projector Q onto  $\Omega$  is generated by forming a matrix A with initial rows consisting of the vectors corresponding to the small singular values and the remaining rows set to zero. Then  $A^TA$  is the projector onto  $\Omega$  and  $I - A^TA$  is the projector onto the boundary polytope.

Once we have found the projectors for the 5-D boundary polytopes, the projectors for their intersections may be generated from their products. The product of two different projectors is not, itself, likely to be a projector, but repeated squaring of that

product rapidly converges to the correct projector (Andrews, 1976). Given these projectors, the process for the remaining boundary polytopes is given in Table 2. This process is similar to the initial process, but three new steps have been added: In step 0 the projector for a particular boundary polytope is read in. In step 2A the vector confirmed by step 2 is projected onto the hyperplane containing the boundary polytope, and step 2B verifies that the projected vector is still a valid unit cell. When doing a random perturbation of a vector already projected onto the hyperplane containing a boundary polytope while looking for intersections with that boundary polytope, it is sufficient to use a random vector projected onto that the hyperplane containing the boundary polytope. However, that risks missing some very low dimension cases. That search produced 215 distinct boundary polytopes. The search was then redone, stepping back into the Niggli cone after each projection, and using a full 6-D spherical random search to ensure catching any nearby boundary polytopes. That search added one more distinct boundary polytope, for a total of 216 boundary polytopes.

The dimension of a boundary polytope can be determined by computing the number of eigenvalues equal to 1 of the projector onto the hyperplane containing the boundary polytope, and having distinct boundary projectors is a sufficient condition for two boundary polytopes to be distinct. However, distinct projectors is a necessary, but not sufficient, condition for two boundary polytopes to be distinct, because crossing one bounding hyperplane in two different places can require two different transformation matrices to reduce the result. The reduction transformation matrices themselves are needed to disambiguate cases with the identical bounding hyperplane projector.

In the course of the Monte Carlo investigation of the boundary polytopes resulting from combinations of 5-D boundary polytopes, we track the relative populations as an indicator of a consistent assignment of dimension. The candidates for assignment to a particular dimension are sorted by population, and the list is cut off on a precipitous drop of more than an order of magnitude. For the remaining populations, the mean population  $\mu$  and estimated standard deviation  $\sigma$  are computed. For each population  $\tau$ , a Z-score,  $(\tau - \mu)/\sigma$ , is computed (see http://en.wikipedia.org/wiki/Standard\_score). Z-scores of less than -1 suggest the possible need for further study of the boundary polytopes involved. A combination of the population analysis resulting from the Monte Carlo search, algebraic analysis of constraints and computation of the eigenvalues of projectors allows the identification of the dimensions of the boundary polytopes, helps to identify distinct combinations of intersections of 5-D boundary polytopes that represent the same lower dimensional boundary polytopes and confirms the critical initial identification of the 15 5-D boundary polytopes identified purely by the Monte Carlo search.

We limit our consideration of valid boundary polytopes to those avoiding the mathematically interesting but crystallographically impossible cases of zero length cell edges. Combinations of boundary polytopes without a valid intersection or with an intersection that would force any of  $g_{\{1,2,3\}}$  to zero or that did not have neighboring Nigglireduced probe points are eliminated. 574 combinations of 1 through 8 intersecting 5-D boundary polytopes were not degenerate. Many combinations represent equivalent boundary polytopes. There are 216 distinct boundary polytopes. There are 15 5-D boundary polytopes of the full  $G^6$  Niggli cone, 53 4-D boundary polytopes resulting from intersections of pairs of the 15 5-D boundary polytopes, 79 3-D boundary polytopes resulting from the 2-fold and higher intersections of the 15 5-D boundary polytopes, 55 2-D boundary polytopes resulting from 2-fold and higher intersections of the 15 5-D boundary polytopes, 14 1-D boundary polytopes resulting from 3-fold and higher intersections of the 15 5-D boundary polytopes. The ability of the intersection of only 2 5-D boundary polytopes to produce 4-D, 3-D or 2-D boundary polytopes results from the additional constraints imposed by Niggli reduction.

For the 5-D boundary polytopes, three special cases arise in which the Niggli reduction conditions divide a single polytope into two sub-polytopes, the "flat boundary intersections". In each of those three cases, instead of two boundary polytopes meeting at an angle, two boundary polytopes meet edge on. These three cases are  $g_4 = g_2$ ,  $g_5 = g_1$ , and  $g_6 = g_1$ . In each case the division in the polytope is based on the equality of the other two members of  $g_{\{4,5,6\}}$ . For example, when  $g_4 = g_2$ , the division is along  $g_5 = g_6$ . Therefore, when multiplying projectors, instead of multiplying the projector for  $g_4 = g_2$  by itself when the two half-polytopes are required, the second projector is replaced by the projector for the division, *i.e.* in the example given instead of multiplying the projector for  $g_4 = g_2$  by itself, it is multiplied by the projector for  $g_5 = g_6$ .

Table 1. Initial process to locate 5-D boundary polytopes

- 1. Generate a random vector in  $G^6$ .
- 2. Confirm that the vector represents a proper unit cell (for instance, the sum of the interaxial angles must be less than 360 degrees).
- 3. Niggli-reduce the vector.
- 4. Randomly perturb the vector resulting from step 3.
- 5. Confirm that the perturbed vector represents a proper unit cell.
- 6. Niggli-reduce the vector from step 5, accumulating the total transformation matrix from the vector of step 3 to the new reduced vector.
- 7. If the transformation is the unit matrix, then the perturbed vector was not near the boundary of N. Discard the trial. Otherwise, proceed.
- 8. If the transformation matrix has been discovered before, increment a counter for its occurrences. Otherwise, add it to the list of discovered transformations.
- 9. Repeat many times, starting at step 1.

Table 2. Process to locate lower-dimensional boundary polytopes.

- 0. Read in the projector for the desired boundary to be probed.
- 1. Generate a random vector in  $G^6$ .
- 2. Confirm that the vector represents a proper unit cell (for instance, the sum of the interaxial angles must be less than 360 degrees).
- 2A. Project the vector confirmed in step 2 onto the boundary.
- 2B. Confirm that the projected vector is still a valid unit cell.
- 3. Niggli-reduce the vector.
- 4. Randomly perturb the vector resulting from step 3.
- 5. Confirm that the perturbed vector represents a proper unit cell.
- 6. Niggli-reduce the vector from step 5, accumulating the total transformation matrix from the vector of step 3 to the new reduced vector.
- 7. If the transformation is the unit matrix, then the perturbed vector was not near the boundary of N. Discard the trial. Otherwise, proceed.
- 8. If the transformation matrix has been discovered before, increment a counter for its occurrences. Otherwise, add it to the list of discovered transformations.
- 9. Repeat many times, starting at step 1.

Table 3. The 53 4-D boundary polytopes. The boundary conditions use the symbol notation of Table 1 in the main text for the 5-D boundary polytopes. The bounding 4-D polytopes of each of the 15 5-D boundary polytopes can be read off from this table by going down the appropriate column to the main diagonal and then across. For example, the edges of the 3 polytope are 13, 23, 34, 35, 3A, 3B, 3D and 3E.

$g_2 = g_3$	$g_4 = 0$	$g_5 = 0$	$g_6 = 0$	a-face-diagonals		b-face-diagonals			c-face-diagonals			body	
12	13	14	15	16	17	18	19	1A	1B	1C	1D	1E	1F
	23	24	25	26	27	28	29	2A	2B	2C	2D	2E	2F
		34	35					3A	3B		3D	3E	
			45		47	48				4C		$4\mathrm{E}$	
				56		58	59		5B				
					67		69						
										7C			
													8F
								9A		9C			
											AD		
												BE	$_{ m BF}$
											CD		
													$\operatorname{EF}$

Table 4. The 79 3-D boundary polytopes. In some cases the most natural presentation of a given 3-D polytope is a 4-fold intersection. In each of those cases an equivalent 3-fold intersection is given in parentheses immediately below the 4-fold.

$g_4 = 0$	$g_5 = 0$	$g_6 = 0$	a-face-diagonals				ce-diago		c-fac	body		
123	124 134	125 135 145	126 156	127 147 167	128 148 158	129 159 169	12A 13A	12B 13B 15B	12C 14C	12D 13D	12E 13E 14E	12F
				101		100			17C			18F
							19A			1AD		
												1BF
										1CD		1EF
	234	235 245		247	248		23A	23B	24C	23D	23E 24E	
		210	256	267	258	259		25B	210		212	
				207		269			27C			
							29A		29C			28F
										2AD	2BE	2BF
										2CD	<b>-</b> 22	2EF
		345							34CD		34E	ZEF
						359A		35B	(34C)			
						(359)				3AD		
				4567							3BE	
				(456)								
					458				47C		48EF (48E)	
						569		58BF				
						679C		(58B)				
						(679)			0.1.05			
									9ACD (9AC)			
												BEF

Table 5. The 55 2-D boundary polytopes

$g_5 = 0$	$g_6 = 0$	a-face-diagonals		b-fa	ace-diago	onals	c-fac	body			
1234	1235			123A 123B				, i			
	1245		1247	1248				124C		124E	
		1256	100-	1258	1259		125B	10-0			
			1267		1269			127C			190E
						129A					128F
						12371			12AD		
											12BF
									12CD		
											12EF
	1345						134CD			134E	
							(134C)				
						1359A	135B				
						(1359)	1002				
						,			13AD	13BEF	
										(13BE)	
		14567		1458							
		(1456)						147C			
								1470	148EF		
									(148E)		
					1569						
							158BF				
							(158B)	1050105			
								1679ACD			
	2345							(6D, 7A) 234CD		234E	
	2040							(234C)		204L	
					2359A		235B	(====)			
					(2359)						
									23AD		
		04505		0.450						23BE	
		24567 (2456)		2458							
		(2400)						247C			
								248EF			
								(248E)			
					2569						
							258BF				
						2679C	(258B)				
						(2679)					
						(2013)	29ACD				
							(29AC)				
							-				2BEF

Fig. 1. Illustration of Monte Carlo search for boundary polytopes in  $G^6$ . The hatched line represents a boundary polytope, e.g.  $g_2 = g_4$ . The unhatched side of the boundary (N) consists of Niggli-reduced cells. In this case the hatched side is divided into two regions, NN1 (e.g.  $g_5 \ge g_6)$  and NN2 (e.g.  $g_5 < g_6)$  for which different reduction matrices are required to get a Niggli-reduced cell, e.g.  $M_6$  for NN1 and  $M_7$  for NN2. "NN" stands for not Niggli-reduced. V1 is a randomly generated probe point in region N for which a random short line reaches across the boundary to reach region NN1, so the starting point is associated with  $M_6$ . V2, V4 and V5 are randomly generated probe points for which the random short line remains in the Niggli-reduced region N. Therefore V2, V4 and V5 are discarded. V3 is a randomly generated probe point in region N for which a random short line reaches across the boundary to reach region NN2, so the starting point is associated with  $M_7$ . Because of this difference in reduction matrices, the boundary polytope is treated as consisting of two distinct boundary polytopes, in this instance cases 6 and 7.

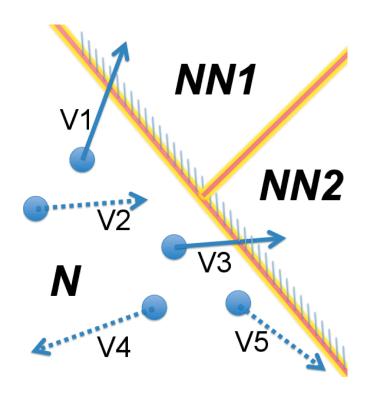


Fig. 2. Counts of points found near various boundary polytopes in 100 million trials, organized in declining order of counts, showing the most populated 23 of the 92 boundary polytopes found in this run. This is a run with no filtering for any particular boundary with the counts shown on a logarithmic scale. Note the precipitous drop of nearly 2 orders of magnitude after the first 15 boundary polytopes. This drop confirms that those 15 boundary polytopes are the 5-D boundary polytopes and that there is a vanishingly small probability of there being any other 5-D boundary polytopes of the Niggli-reduced cells.

