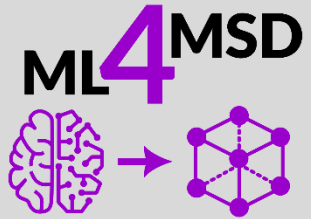


ME 5374-ST



Machine Learning for Materials Science and Discovery

Fall 2025

Asst. Prof. Peter Schindler

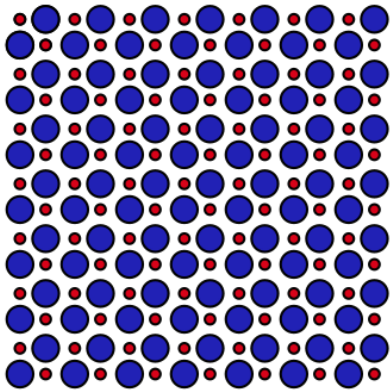
Lecture 7 – Crystallography Crash Course and Pymatgen

- Lattices and Unit Cells
- 2D and 3D Bravais Lattices
- Symmetry in Crystals
- Crystallographic Point Groups and Space Groups
- Closed Packed and Other Common Crystal Structures
- Fractional/Cartesian Coordinates and the Metric Tensor

Order in Materials

Crystalline

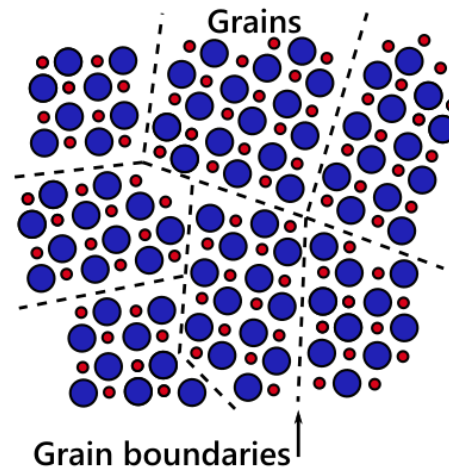
3D long range order
repeating *unit cell*



Si wafer
Diamond
Minerals

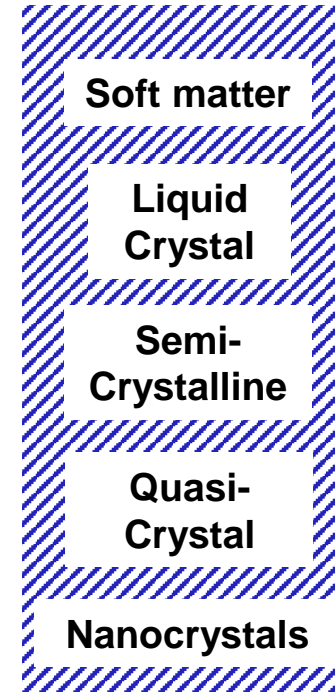
Polycrystalline

Medium range order
Grains separated by GB



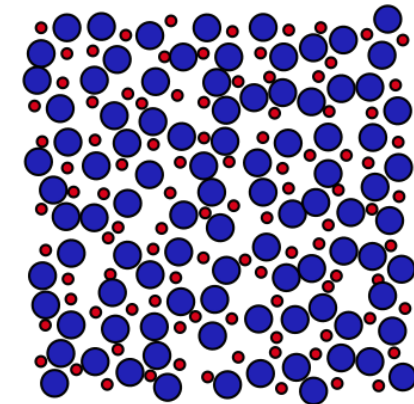
random / textured

Gate electrode in
transistor
Aluminum contacts
Metals



Amorphous

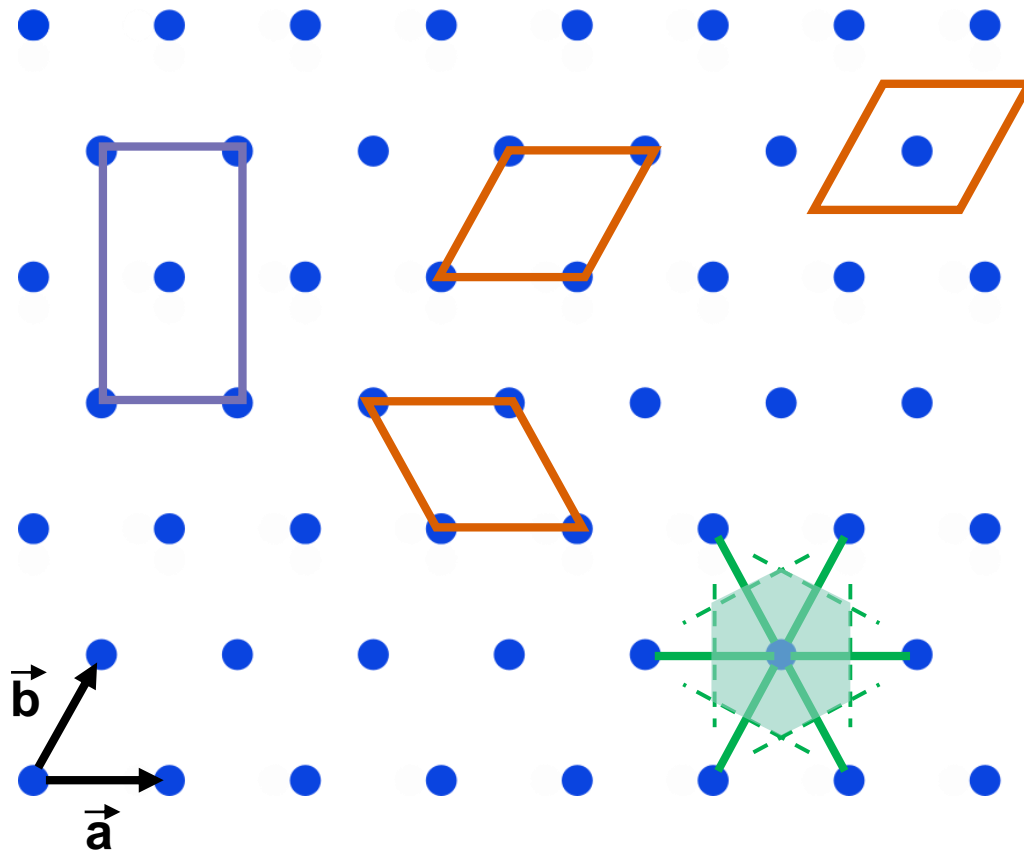
No order
(only short range)



Gate oxide
in transistor
Glass
Ceramics

Lattice and Unit Cells

Lattice = infinite arrangement of points in space; each point has *identical surroundings*



Unit cell

Volume that if repeated by lattice vectors covers the entire lattice (no gaps/holes)
-not unique

Primitive unit cell

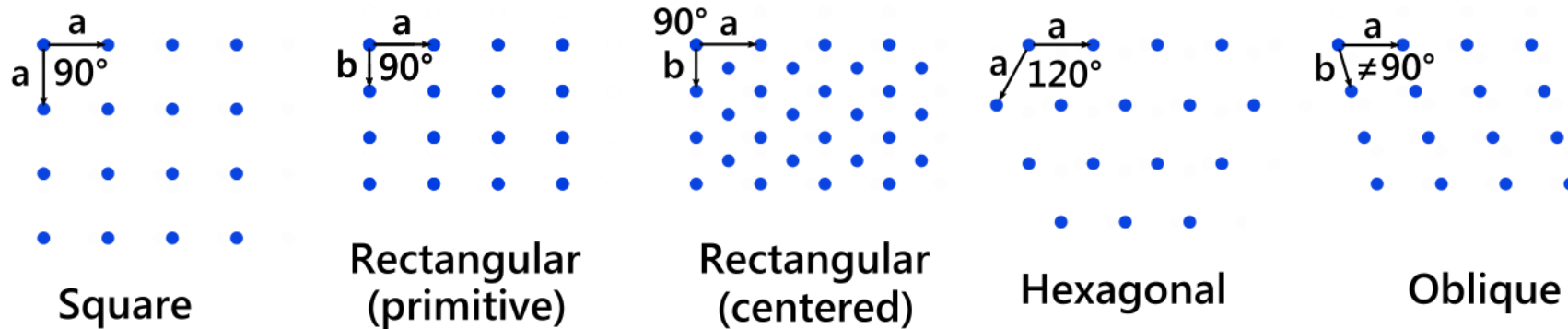
Unit cell with only one lattice point (= smallest unit cell)
[not always used for visualization]
-not unique

Wigner-Seitz cell

Volume that's closer to a specific lattice point than to any other;
is also a primitive unit cell
-unique

Unique Lattices in 2D and 3D

In **2D** → **5** unique unit cell shapes called **Bravais** lattices:



In **3D** → **7 lattice systems** and **4 centering types** → **14 Bravais lattices**

Triclinic, Monoclinic,
Orthorhombic, Tetragonal,
Hexagonal, Rhombohedral
and Cubic

P Primitive
I Body centered
F Face centered
C Base centered

Crystal = Lattice + Motif (also called 'basis')

7 lattice systems (define valid periodic tilings) → 32 point groups

14 Bravais lattices (define valid translations) → 230 space groups

14 Bravais Lattices

Lattices in 3D:

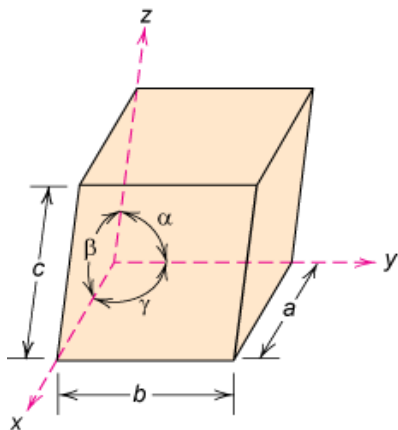
Defined by


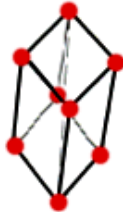
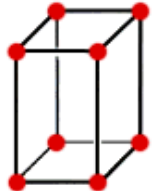
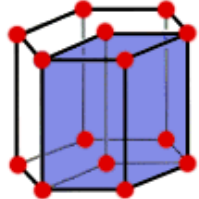
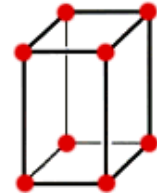
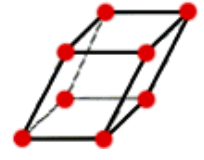
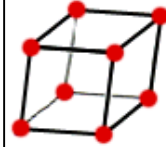
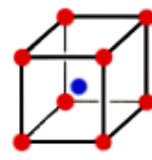
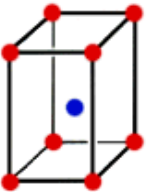
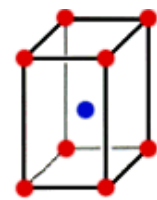
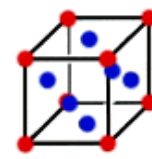
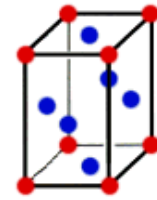
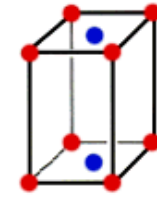
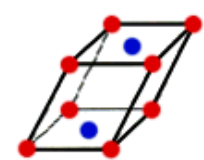
unit cell vectors:

$$\{\vec{e}_i\} = \{\vec{a}, \vec{b}, \vec{c}\}$$

or lattice parameters

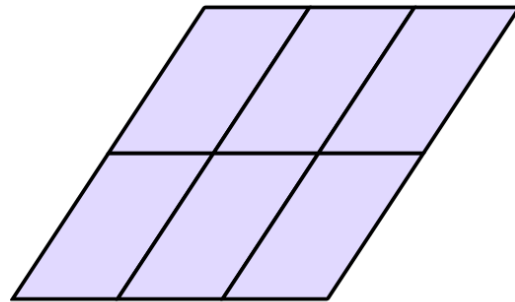
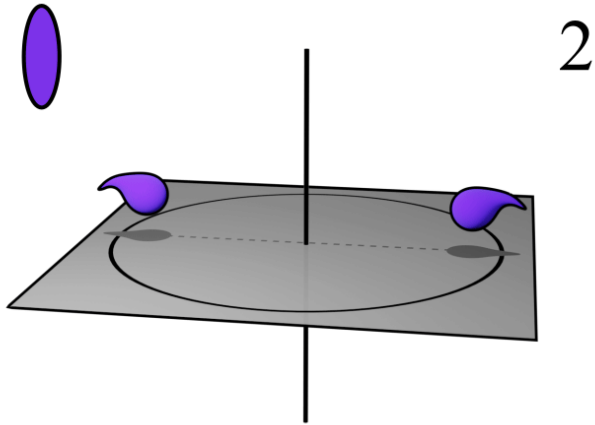
$$\{a, b, c, \alpha, \beta, \gamma\}$$



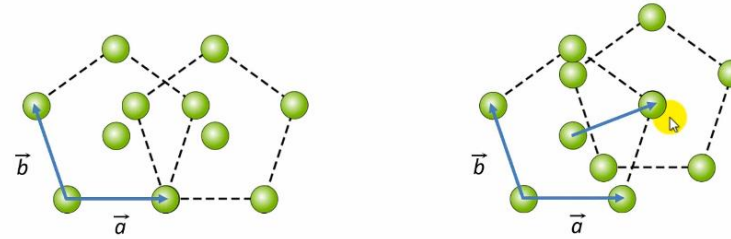
	Cubic	Rhombohedral	Tetragonal	Hexagonal	Orthorhombic	Monoclinic	Triclinic
P Primitive							
I Body centered							
F Face centered							
C Base centered							

Symmetry in Crystals

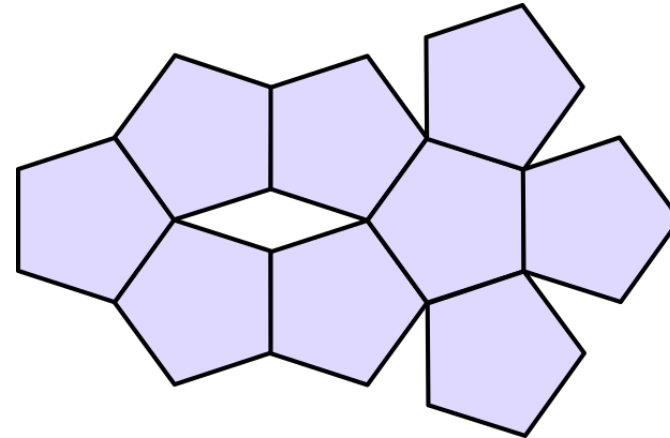
Rotational symmetry



2-fold (180°)



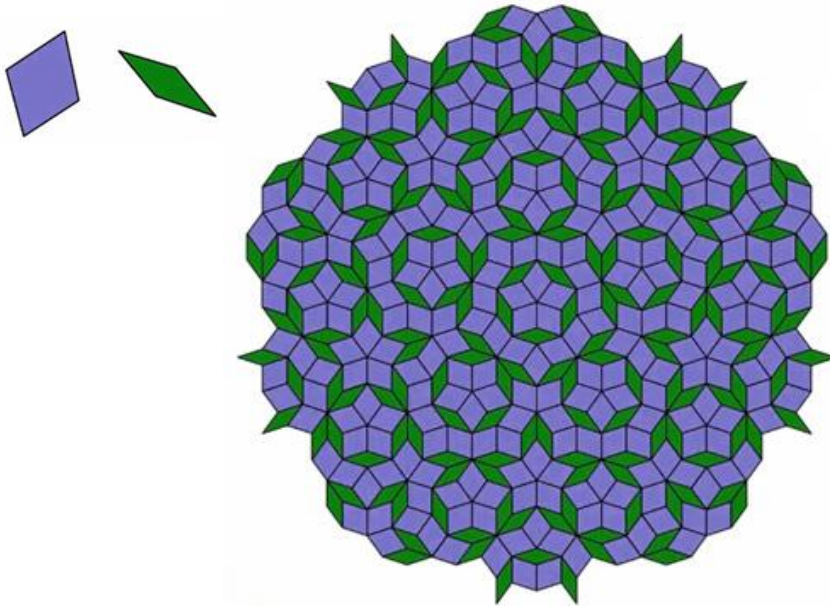
Pentagons *do not* tile the plane without **gaps**



Symmetry in Crystals

<https://www.youtube.com/watch?v=48sCx-wBs34>

<https://csfulop.github.io/PenroseMoire/?x=212?y=0?r=0>

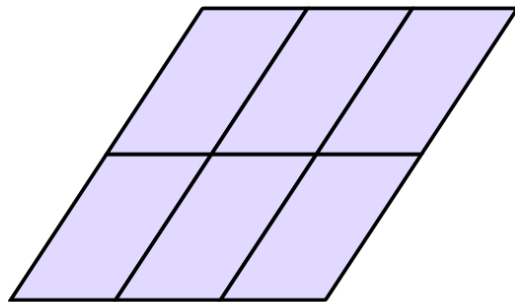
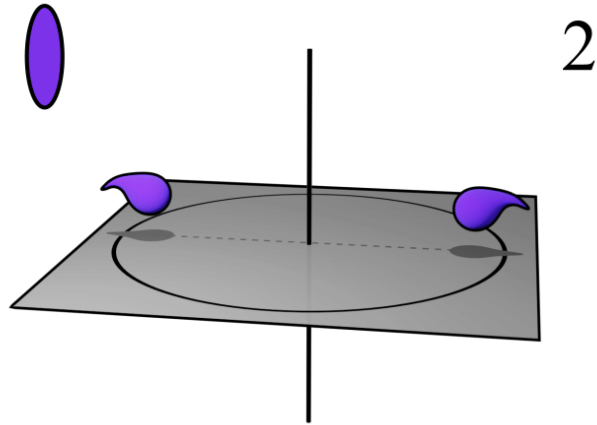


Al₆Mn, D. Schechtman
Chemistry Nobel prize 2011

L. Pauling: *"There are no quasicrystals, only quasi-scientist"*

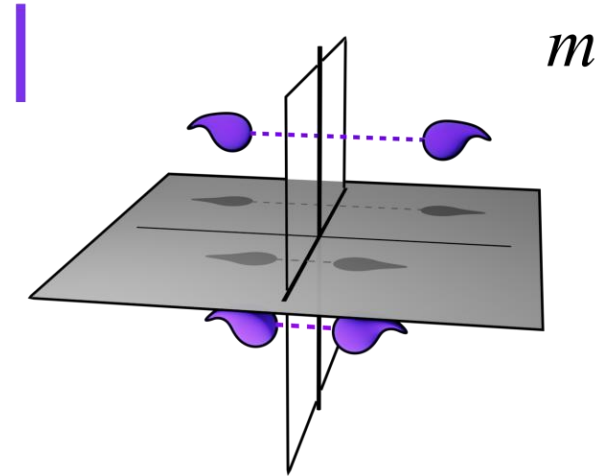
Symmetry in Crystals

Rotational symmetry

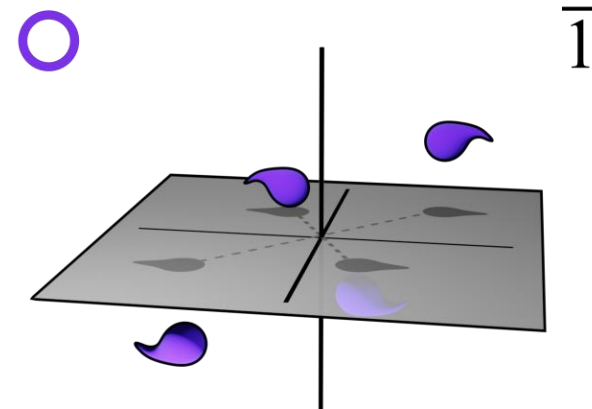


2-fold (180°)

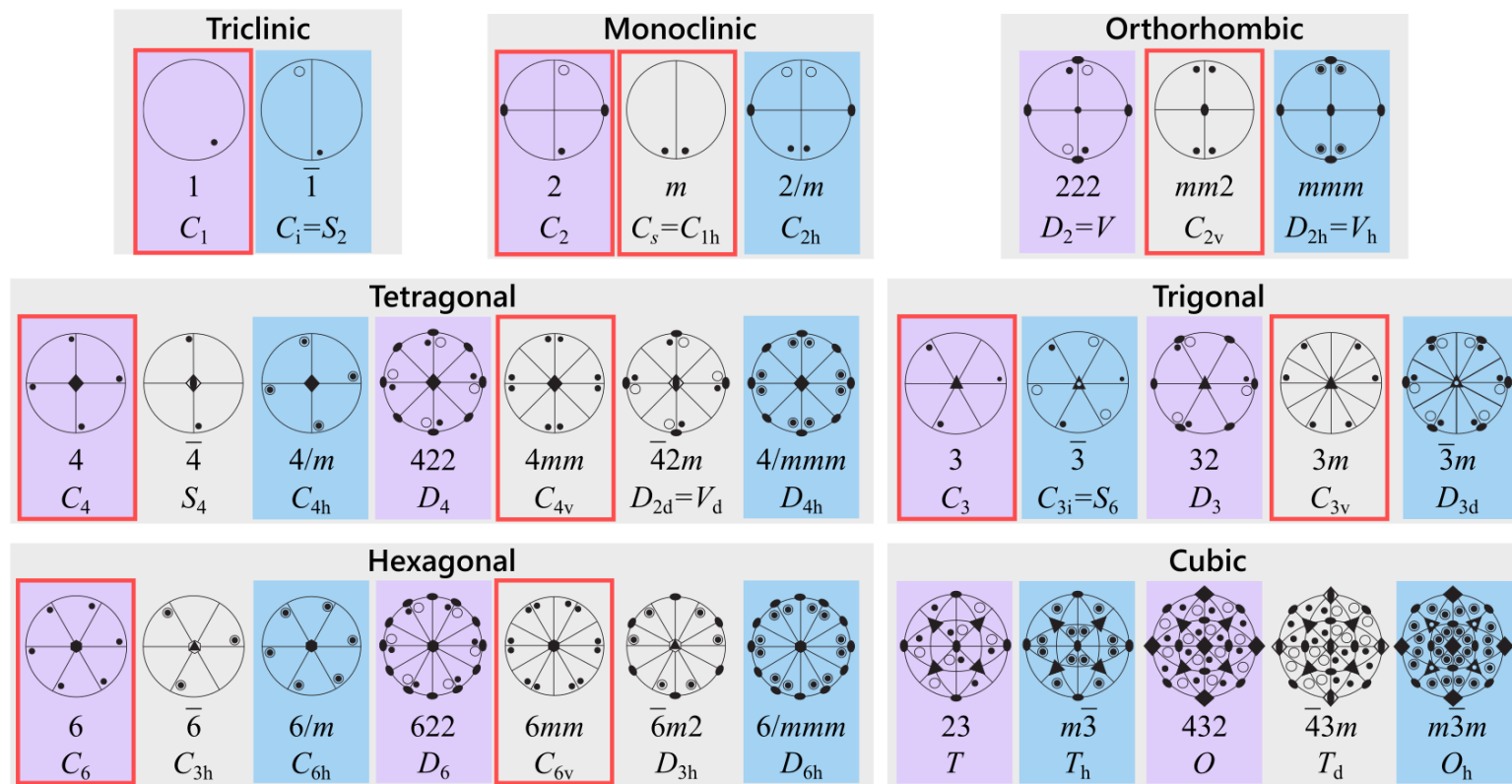
Mirror symmetry



Inversion symmetry

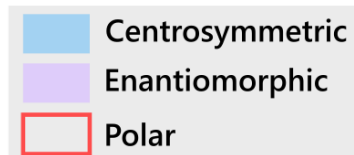


Crystallographic Point Groups



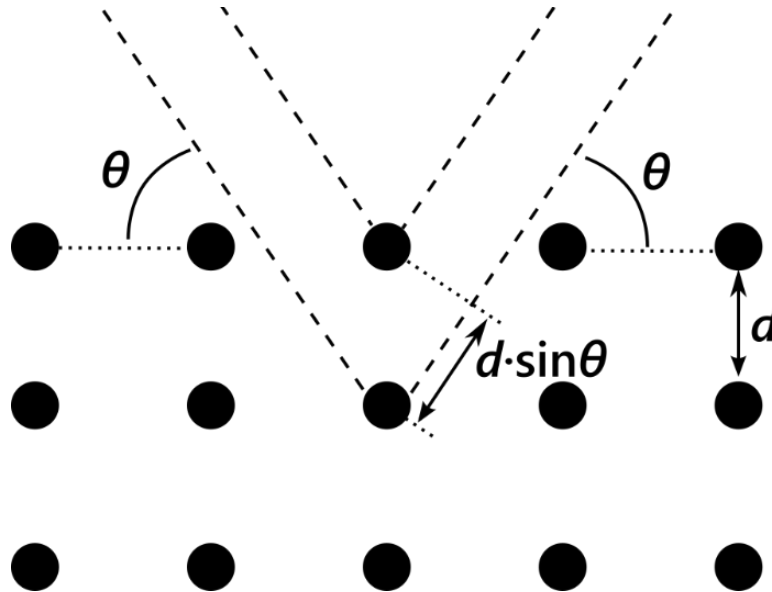
Notation: Hermann-Mauguin / Schönflies

Detailed diagrams: <http://pd.chem.ucl.ac.uk/pdnn/symm2/pntgrp1.htm>



Symmetry – So What?

1. Enables identification of materials using scattering techniques



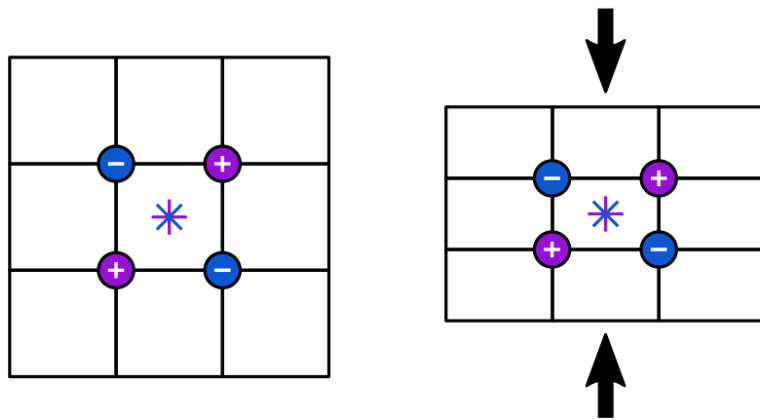
Bragg's law

$$2d \sin \theta = n\lambda$$

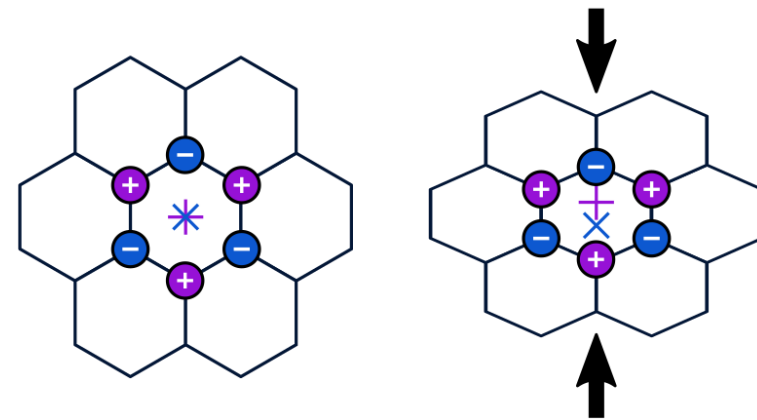
Symmetry – So What?

2. Enables prediction of certain material properties qualitatively

Centrosymmetric



Non-centrosymmetric



Neumann's Principle

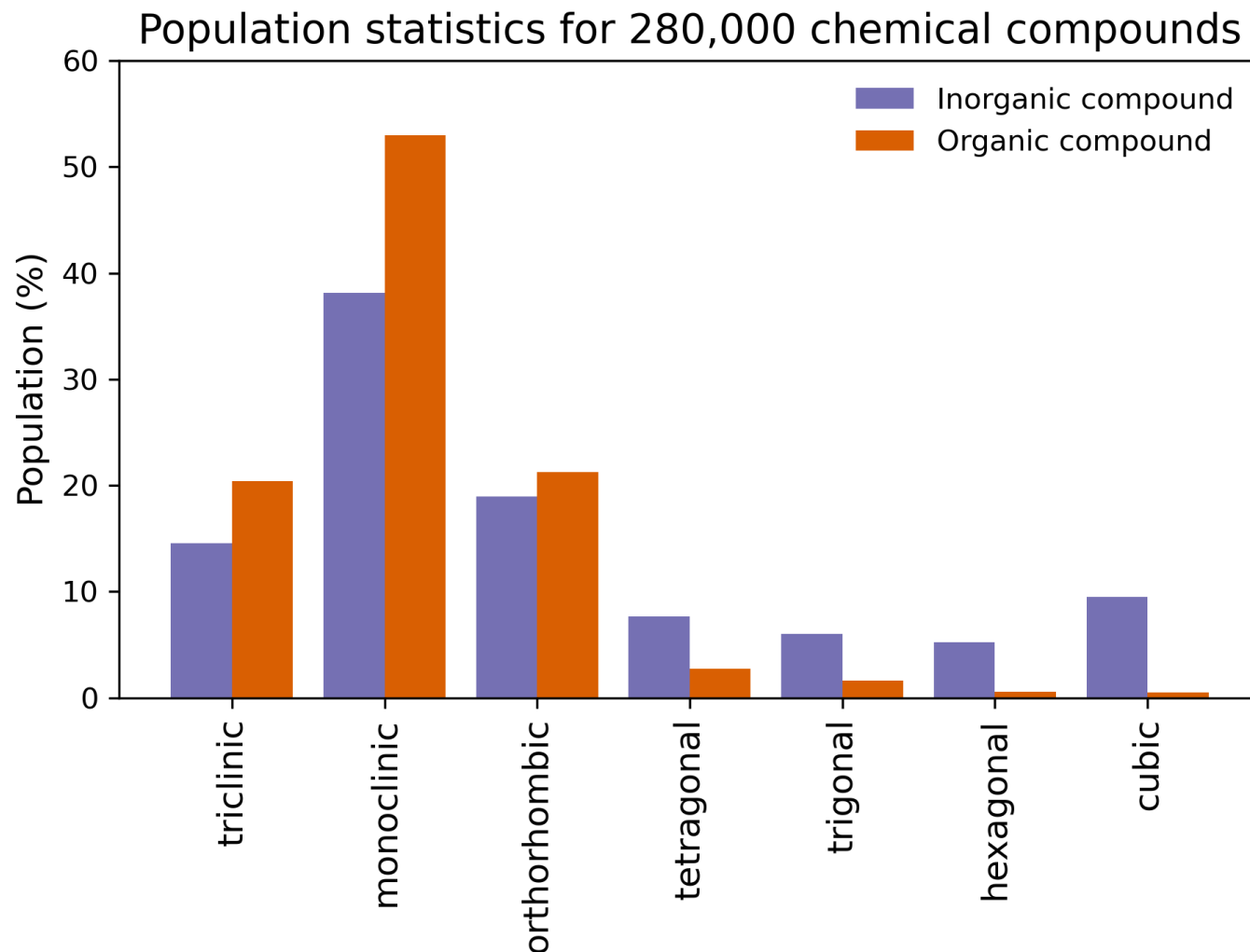
Symmetry of any *physical property* of a crystal must include the *symmetry elements* of its point group

Symmetry – So What?

List of allowed/forbidden properties based on point group symmetry:

Property	Centrosymmetric (with inversion)	Enantiomorphic (chiral, no inversion/mirror)	Polar (unique axis)	Polar + Enantiomorphic
Piezoelectricity	✗ Forbidden	✓ Allowed	✓ Allowed	✓ Allowed
Ferroelectricity	✗ Forbidden	✗ Forbidden	✓ Allowed	✓ Allowed
Pyroelectricity	✗ Forbidden	✗ Forbidden	✓ Allowed	✓ Allowed
Optical activity (chirality)	✗ Forbidden	✓ Allowed	✗ Forbidden	✓ Allowed
Second Harmonic Generation (SHG)	✗ Forbidden	✓ Allowed	✓ Allowed	✓ Allowed

Symmetry in Crystals – Statistics

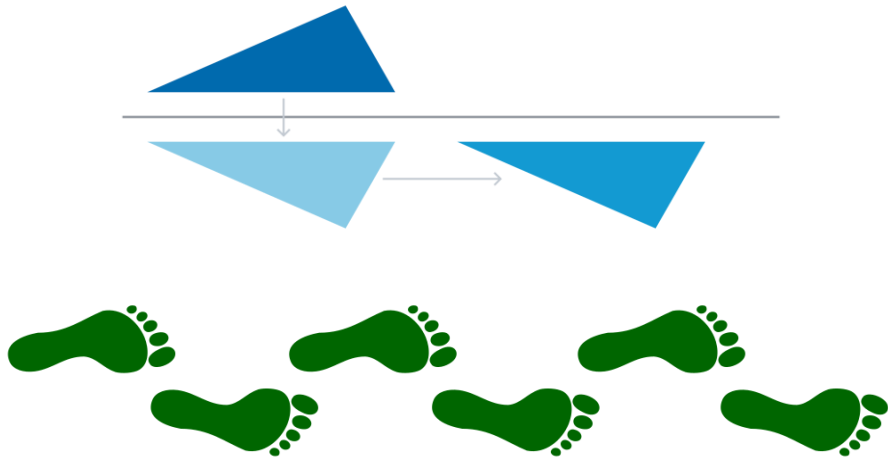


Space Groups

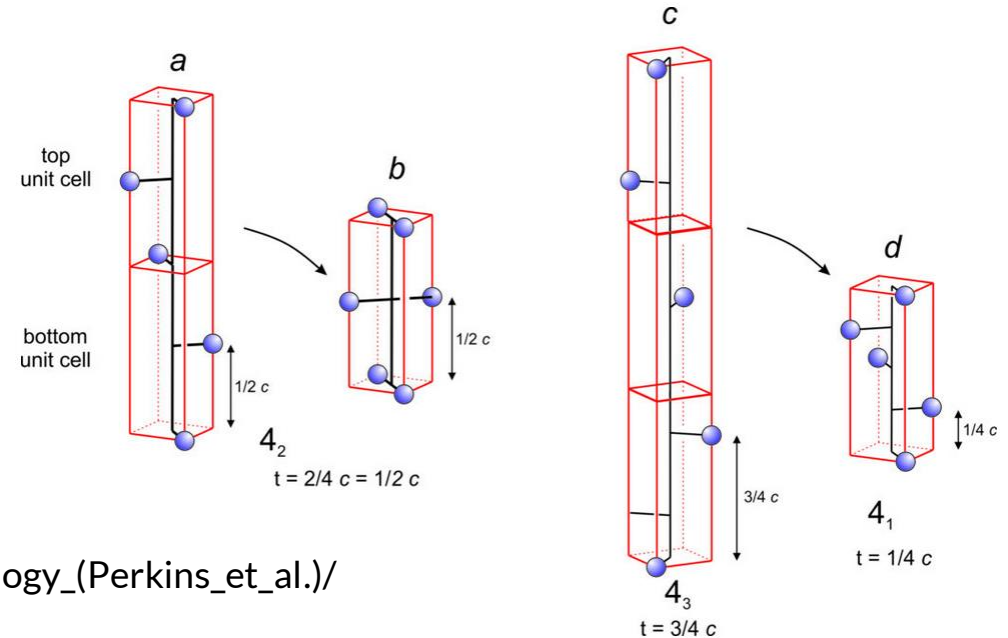
Also considers allowed translations within the lattice
(centering types of Bravais lattices)

Adds two symmetry operations:

Glide Plane



Screw Axis



wikipedia.org and [https://geo.libretexts.org/Bookshelves/Geology/Mineralogy_\(Perkins_et_al.\)/](https://geo.libretexts.org/Bookshelves/Geology/Mineralogy_(Perkins_et_al.)/)

Space Groups

Glide Plane

1. Reflection at a plane
2. Translation (either $\frac{1}{2}$ or $\frac{1}{4}$)

Possible glide planes:

$a \rightarrow$ reflection $(a,b) + \frac{1}{2}$ transl. in a direction

$b \rightarrow$ reflection $(b,c) + \frac{1}{2}$ transl. in b direction

$c \rightarrow$ reflection $(b,c) + \frac{1}{2}$ transl. in c direction

$n \rightarrow$ see video*

$d \rightarrow$ see video*

$e \rightarrow$ see video*

Screw Axis

n_m screw axis where $m < n$:

1. Rotation by $360^\circ/n$
2. Translation by m/n of the unit cell parallel to the screw axis

Possible screw axes:

$2_1, 3_1, 4_1, 4_2, 6_1, 6_2$, and 6_3

Enantiomorphous ones: $3_2, 4_3, 6_4, 6_5$

→ 230 Space groups

Space Group Diagrams

Symmetry operation symbols:

Full explanation here:

<http://img.chem.ucl.ac.uk/sgp/mainmenu.htm>

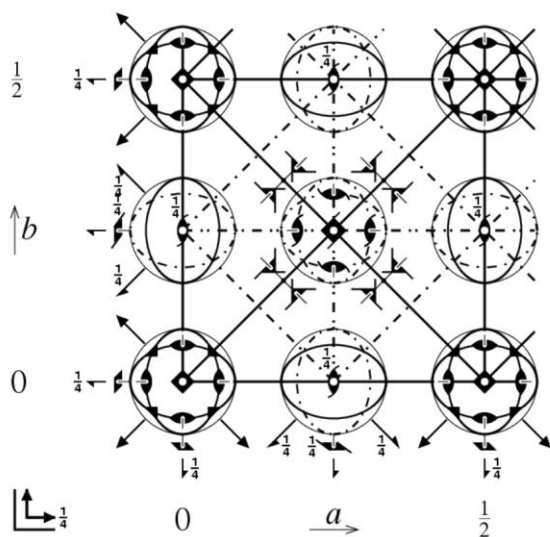
NaCl example:

$Fm\bar{3}m$

$F 4/m \bar{3} 2/m$

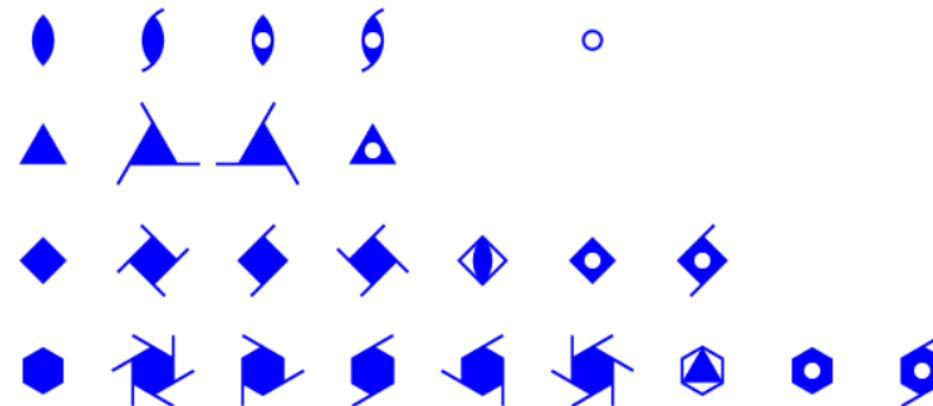
$m\bar{3}m$

No. 225



- | | |
|--------------------------------|--------------------------------|
| 1 x, y, z | 25 $\bar{x}, \bar{y}, \bar{z}$ |
| 2 x, y, \bar{z} | 26 \bar{x}, y, z |
| 3 \bar{x}, y, \bar{z} | 27 x, y, z |
| 4 \bar{x}, \bar{y}, z | 28 x, y, \bar{z} |
| 5 \bar{z}, x, y | 29 $\bar{z}, \bar{x}, \bar{y}$ |
| 6 \bar{z}, \bar{x}, y | 30 \bar{z}, x, \bar{y} |
| 7 \bar{z}, x, \bar{y} | 31 \bar{z}, \bar{x}, y |
| 8 $\bar{z}, \bar{x}, \bar{y}$ | 32 \bar{z}, x, y |
| 9 y, \bar{z}, x | 33 y, z, \bar{x} |
| 10 $\bar{y}, \bar{z}, \bar{x}$ | 34 y, z, x |
| 11 \bar{y}, z, x | 35 y, \bar{z}, \bar{x} |
| 12 y, \bar{z}, \bar{x} | 36 y, z, x |
| 13 x, \bar{z}, y | 37 $\bar{x}, \bar{z}, \bar{y}$ |
| 14 x, \bar{z}, \bar{y} | 38 \bar{x}, z, y |
| 15 \bar{x}, \bar{z}, y | 39 x, \bar{z}, y |
| 16 \bar{x}, z, y | 40 x, \bar{z}, \bar{y} |
| 17 \bar{z}, y, \bar{x} | 41 \bar{z}, \bar{y}, x |
| 18 \bar{z}, y, x | 42 $\bar{z}, \bar{y}, \bar{x}$ |
| 19 $\bar{z}, \bar{y}, \bar{x}$ | 43 \bar{z}, y, x |
| 20 \bar{z}, y, x | 44 $\bar{z}, \bar{y}, \bar{x}$ |
| 21 \bar{y}, x, \bar{z} | 45 y, \bar{x}, \bar{z} |
| 22 y, \bar{x}, \bar{z} | 46 y, x, \bar{z} |
| 23 \bar{y}, x, z | 47 y, \bar{x}, z |
| 24 y, \bar{x}, z | 48 \bar{y}, \bar{x}, z |

$+ (0, \frac{1}{2}, \frac{1}{2}), (\frac{1}{2}, 0, \frac{1}{2}), (\frac{1}{2}, \frac{1}{2}, 0)$



Crystal family	Crystal system	Required symmetries of the point group	Point groups	Space groups	Bravais lattices	Lattice system
Triclinic	Triclinic	None	2	2	1	Triclinic
Monoclinic	Monoclinic	1 twofold axis of rotation or 1 mirror plane	3	13	2	Monoclinic
Orthorhombic	Orthorhombic	3 twofold axes of rotation or 1 twofold axis of rotation and 2 mirror planes	3	59	4	Orthorhombic
Tetragonal	Tetragonal	1 fourfold axis of rotation	7	68	2	Tetragonal
Hexagonal	Trigonal	1 threefold axis of rotation	5	7	1	Rhombohedral
	Hexagonal	1 sixfold axis of rotation	7	18	1	Hexagonal
Cubic	Cubic	4 threefold axes of rotation	5	36	3	Cubic
6	7	Total	32	230	14	7

Wyckoff Letters/Positions

Describe the sites in a space group with **distinct symmetries**

Of form: number letter (x, y, z)

e.g., 3c (0, $\frac{1}{2}$, $\frac{1}{2}$)

- Number is the multiplicity (how many sites are generated from the single Wyckoff site)
- Letters start from a and increase roughly from high to low symmetry (different for each space group)
- Fractional coordinate of the location in the cell

Can be looked up for each space group:

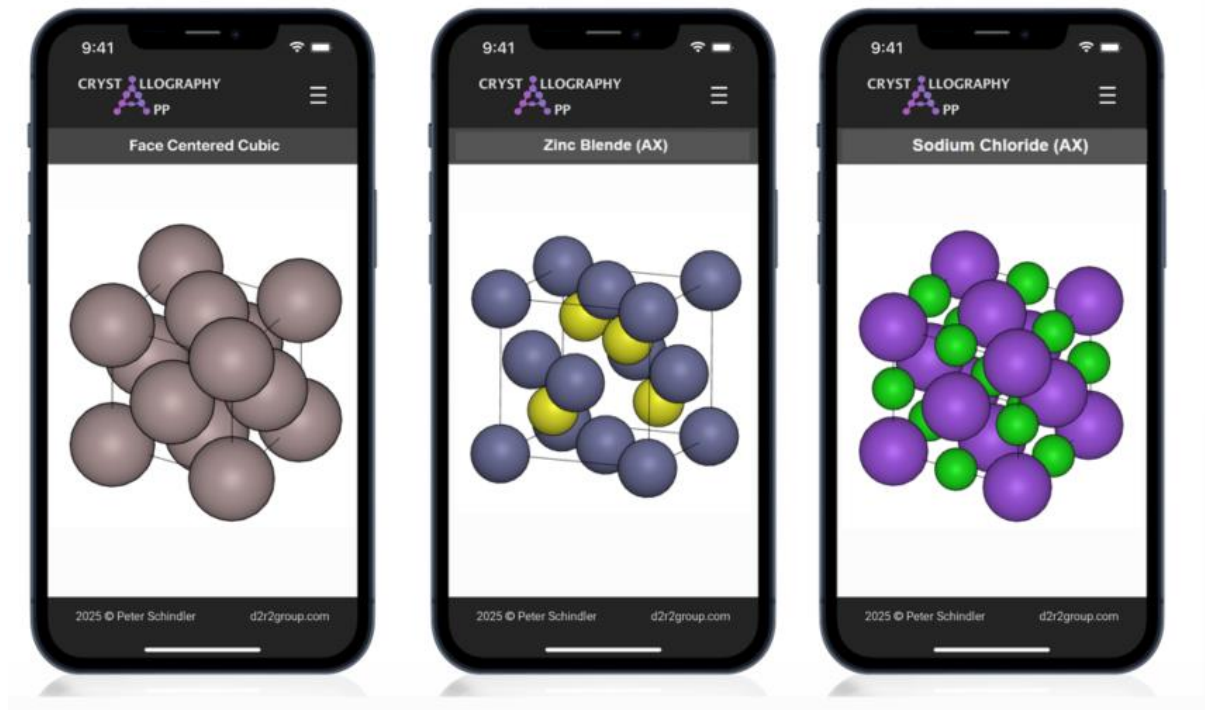
https://www.cryst.ehu.es/cryst/get_wp.html

Space Group *Pm*-3 (No. 200)

Multiplicity	Wyckoff letter	Site symmetry	Coordinates
24	l	1	(x,y,z) (-x,-y,z) (-x,y,-z) (x,-y,-z) (z,x,y) (z,-x,-y) (-z,-x,y) (-z,x,-y) (y,z,x) (-y,z,-x) (y,-z,-x) (-y,-z,x) (-x,-y,-z) (x,y,-z) (x,-y,z) (-x,y,z) (-z,-x,-y) (-z,x,y) (z,x,-y) (z,-x,y) (-y,-z,-x) (y,-z,x) (-y,z,x) (y,z,-x)
12	k	m..	(1/2,y,z) (1/2,-y,z) (1/2,y,-z) (1/2,-y,-z) (z,1/2,y) (z,1/2,-y) (-z,1/2,y) (-z,1/2,-y) (y,z,1/2) (-y,z,1/2) (y,-z,1/2) (-y,-z,1/2)
12	j	m..	(0,y,z) (0,-y,z) (0,y,-z) (0,-y,-z) (z,0,y) (z,0,-y) (-z,0,y) (-z,0,-y) (y,z,0) (-y,z,0) (y,-z,0) (-y,-z,0)
8	i	.3.	(x,x,x) (-x,-x,x) (-x,x,-x) (x,-x,-x) (-x,-x,-x) (x,x,-x) (x,-x,x) (-x,x,x)
6	h	mm2 ..	(x,1/2,1/2) (-x,1/2,1/2) (1/2,x,1/2) (1/2,-x,1/2) (1/2,1/2,x) (1/2,1/2,-x)
6	g	mm2 ..	(x,1/2,0) (-x,1/2,0) (0,x,1/2) (0,-x,1/2) (1/2,0,x) (1/2,0,-x)
6	f	mm2 ..	(x,0,1/2) (-x,0,1/2) (1/2,x,0) (1/2,-x,0) (0,1/2,x) (0,1/2,-x)
6	e	mm2 ..	(x,0,0) (-x,0,0) (0,x,0) (0,-x,0) (0,0,x) (0,0,-x)
3	d	mmm ..	(1/2,0,0) (0,1/2,0) (0,0,1/2)
3	c	mmm ..	(0,1/2,1/2) (1/2,0,1/2) (1/2,1/2,0)
1	b	m-3.	(1/2,1/2,1/2)
1	a	m-3.	(0,0,0)

Ceramic and Other Common Crystal Structures

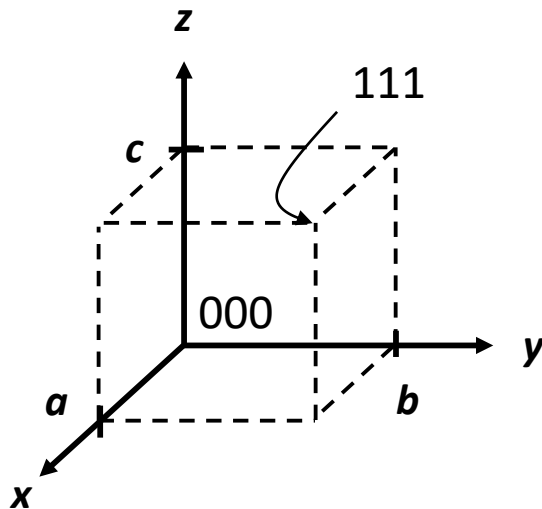
There are a few common crystal structure prototypes for binary ceramics.



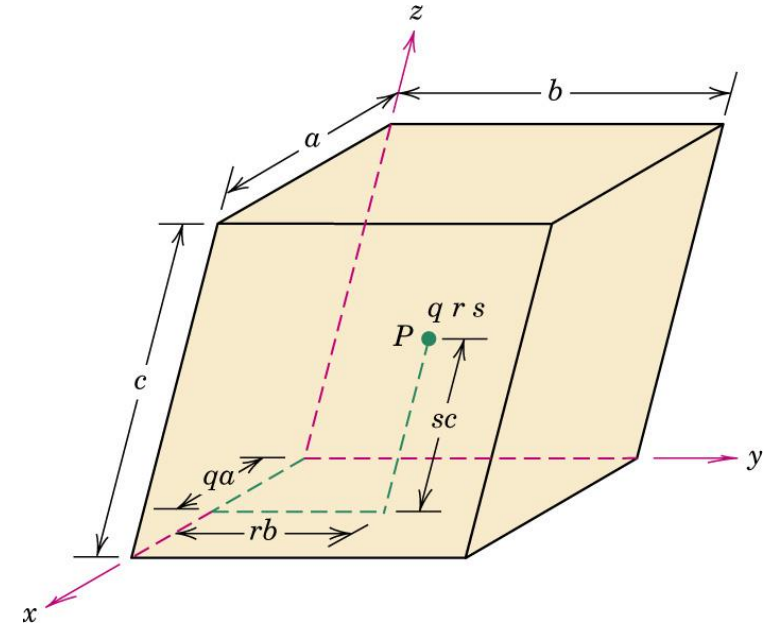
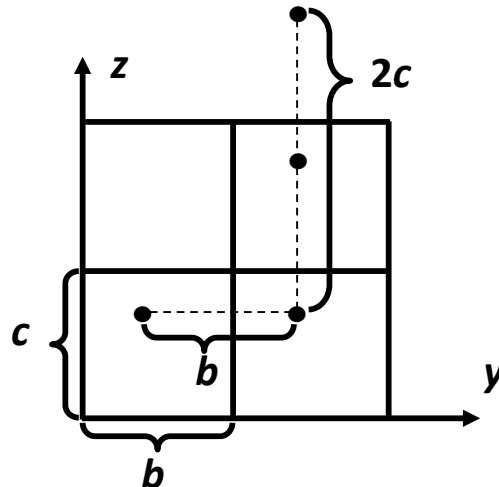
crystallography.app

Fractional Coordinates in Lattices

- qrs represent the coordinates at point P
- The fraction of the lattice parameter (distance) along each axis is given by qrs
- Written **without any parentheses**



Point coordinates:
Center of the unit cell: $\frac{1}{2} \frac{1}{2} \frac{1}{2}$
One corner of the unit cell: 111



Invariance to translation:
Integer multiples of lattice constants
→ *identical position in repeating unit cell*

Metric Tensor and Distances in Lattices

Metric tensor for lattice with unit cell vectors $\{\vec{e}_i\} = \{\vec{a}, \vec{b}, \vec{c}\}$

$$g_{ij} = \vec{e}_i \cdot \vec{e}_j \qquad g = \begin{pmatrix} \vec{a}^2 & \vec{a} \cdot \vec{b} & \vec{a} \cdot \vec{c} \\ \vec{b} \cdot \vec{a} & \vec{b}^2 & \vec{b} \cdot \vec{c} \\ \vec{c} \cdot \vec{a} & \vec{c} \cdot \vec{b} & \vec{c}^2 \end{pmatrix}$$

Can be used to convert fractional to Cartesian coordinates
(and vice versa with the inverse metric tensor, g^{-1})

$$x_{\text{cart}}^i = g_{ij} x_{\text{frac}}^j$$

$$\vec{x}_{\text{cart}} = g \cdot \vec{x}_{\text{frac}}$$

Also used as a norm to get the distance in a lattice
(e.g., distance between two atomic sites $\vec{v} = \vec{x}_1 - \vec{x}_2$):

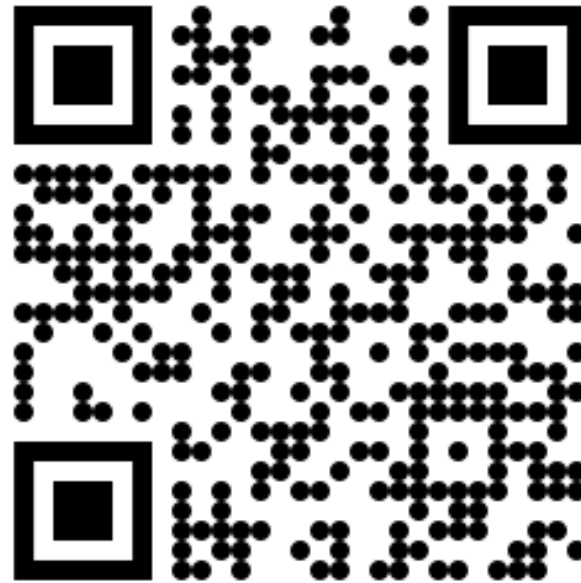
$$d = g_{ij} v_{\text{frac}}^i v_{\text{frac}}^j$$

$$d = v_{\text{frac}} \cdot g \cdot v_{\text{frac}}$$

Things we Didn't Cover

- Packing density calculations [cf. undergrad. MatSci course*]
- Coordination number, number of nearest neighbors [cf. undergrad. MatSci course*]
- Details on ceramic crystal structures [cf. undergrad. MatSci course*]
- Crystallographic directions [cf. undergrad. MatSci course*]
- Crystallographic planes (Miller indices) [cf. undergrad. MatSci course*]
- Reciprocal lattice and reciprocal metric tensor [will cover during DFT]
- *Few more advanced concepts*: Magnetic space groups, laue classes, ...

Lecture Feedback



Please, scan the QR code and take a minute to let me know how the lecture was and mention any **feedback/questions**

This form is **anonymous!**