Statistical modeling of scanning transmission electron microscopy images of crystal interfaces with atomic resolution

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## Crystal structure



Unit cell

# High-Angle Annular Dark Field Scanning Transmission Electron Microscopy



Intensity proportional to atomic number (and number of atoms in a column).

#### Example



 $LaAIO_3$  in the film on the substrate  $SrTiO_3$ 

## Detail



## Goals

- Characterization of a particular crystal, grown with specific environmental conditions
- The position of the interface and its width, that is the degree of intermixing between atoms across the interface in a narrow region.
- The positions of atoms in the B-sites relative to the atoms in the A-sites. Are they affected in the vicinity of the interface?

## Problems

- Physical models are (too) complex
- Imaging. Not constant background. Row-wise dependence.
- A-site atoms have fixed positions in corners of a cube. Not so in images





To the left, LaAlO<sub>3</sub> in the film, to the right  $SrTiO_3$  in the substrate.



Bilinear transformation of each unit cell giving A-site atoms in corners of square. Average unit cell.



Gaussian function fitted to each A-site atom, then removed. Smoothed average unit cell.





A-site atoms removed.





#### Gaussian function fitted to B-site atoms.

#### Image



Vertical averaging. Logistic function fit to A-site atoms.

## Modeling ideas

- 1. Image results from a convolution of an object function (atom column as seen by electrons) with a probe intensity profile
- 2. Probe intensity profile "known".
- 3. Object function possibly Gaussian. (Want to estimate position and height for each atom)
- 4. Incorporate function describing the interface.
- 5. Estimate with maximum likelihood.
- 1-3 already in van Aert et al. (2009)

### More future work

- More than one image of each sample with different rotations in x-y plane
- Images with higher resolution. Possible to see oxygen atoms?
- Testing. Is there a significant difference of atom positions for crystals grown at different oxygen pressure?