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Phys. Rev. Lett. **119**, 158102 — Published 12 October 2017

DOI: [10.1103/PhysRevLett.119.158102](https://doi.org/10.1103/PhysRevLett.119.158102)

# Correlations in scattered x-ray laser pulses reveal nanoscale structural features of viruses

Ruslan P. Kurta,<sup>1,\*</sup> Jeffrey J. Donatelli,<sup>2,3,†</sup> Chun Hong Yoon,<sup>4,‡</sup> Peter Berntsen,<sup>5</sup> Johan Bielecki,<sup>6,1</sup> Benedikt J. Daurer,<sup>6</sup> Hasan DeMirci,<sup>7,8</sup> Petra Fromme,<sup>9</sup> Max Felix Hantke,<sup>6</sup> Filipe R. N. C. Maia,<sup>6,10</sup> Anna Munke,<sup>6</sup> Carl Nettelblad,<sup>11,6</sup> Kanupriya Pande,<sup>12,3</sup> Hemanth K. N. Reddy,<sup>6</sup> Jonas A. Sellberg,<sup>13,6</sup> Raymond G. Sierra,<sup>4</sup> Martin Svenda,<sup>6</sup> Gijs van der Schot,<sup>6</sup> Ivan A. Vartanyants,<sup>14,15</sup> Garth J. Williams,<sup>16</sup> P. Lourdu Xavier,<sup>17,18</sup> Andrew Aquila,<sup>4</sup> Peter H. Zwart,<sup>12,3,§</sup> and Adrian P. Mancuso<sup>1</sup>

<sup>1</sup>European XFEL GmbH, Holzkoppel 4, D-22869 Schenefeld, Germany

<sup>2</sup>Mathematics Department, Lawrence Berkeley National Laboratory, 1 Cyclotron Road, Berkeley, CA 94720, USA

<sup>3</sup>Center for Advanced Mathematics for Energy Research Applications, 1 Cyclotron Road, Berkeley, CA 94720, USA

<sup>4</sup>Linac Coherent Light Source, SLAC National Accelerator Laboratory,  
2575 Sand Hill Road, Menlo Park, CA 94025, USA

<sup>5</sup>Australian Research Council Centre of Excellence in Advanced Molecular Imaging,  
La Trobe Institute for Molecular Science, La Trobe University, Melbourne 3086, Australia

<sup>6</sup>Laboratory of Molecular Biophysics, Department of Cell and Molecular Biology, Uppsala University, Sweden

<sup>7</sup>Biosciences Division, SLAC National Accelerator Laboratory,  
2575 Sand Hill Road, Menlo Park, CA 94025, USA

<sup>8</sup>Stanford PULSE Institute, SLAC National Accelerator Laboratory,  
2575 Sand Hill Road, Menlo Park, CA 94025, USA

<sup>9</sup>Biodesign Center for Applied Structural Discovery and School of Molecular Sciences,  
Arizona State University, Tempe, AZ 85287-1604, USA

<sup>10</sup>NERSC, Lawrence Berkeley National Laboratory, Berkeley, California, USA

<sup>11</sup>Division of Scientific Computing, Science for Life Laboratory,  
Department of Information Technology, Uppsala University, Sweden

<sup>12</sup>Molecular Biophysics and Integrated Bioimaging,  
Lawrence Berkeley National Laboratory, 1 Cyclotron Road, Berkeley, CA 94720, USA

<sup>13</sup>Biomedical and X-Ray Physics, Department of Applied Physics, AlbaNova University Center,  
KTH Royal Institute of Technology, Stockholm SE-106 91, Sweden

<sup>14</sup>Deutsches Elektronen-Synchrotron DESY, Notkestraße 85, D-22607 Hamburg, Germany

<sup>15</sup>National Research Nuclear University MEPhI (Moscow Engineering  
Physics Institute), Kashirskoe shosse 31, 115409 Moscow, Russia

<sup>16</sup>NSLS-II, Brookhaven National Laboratory, PO Box 5000, Upton, NY 11973, USA

<sup>17</sup>Center for Free-Electron Laser Science, Deutsches Elektronen-Synchrotron DESY, Notkestraße 85, 22607 Hamburg, Germany

<sup>18</sup>Max-Planck Institute for the Structure and Dynamics of Matter, 22607 Hamburg, Germany

(Dated: September 7, 2017)

We use extremely bright and ultrashort pulses from an x-ray free-electron laser (XFEL) to measure correlations in x-rays scattered from individual bioparticles. This allows us to go beyond the traditional crystallography and single-particle imaging approaches for structure investigations. We employ angular correlations to recover the three-dimensional (3D) structure of nanoscale viruses from x-ray diffraction data measured at the Linac Coherent Light Source. Correlations provide us with a comprehensive structural fingerprint of a 3D virus, which we use both for model-based and *ab initio* structure recovery. The analyses reveal a clear indication that the structure of the viruses deviates from the expected perfect icosahedral symmetry. Our results anticipate exciting opportunities for XFEL studies of the structure and dynamics of nanoscale objects by means of angular correlations.

PACS numbers: 42.30.-d, 87.64.-t, 87.59.-e

Since the original idea to image individual biomolecules with intense ultrashort x-ray pulses was proposed [1, 2], its practical implementation for materials research and structural biology applications has become one of most attractive challenges at x-ray free-electron lasers (XFELs) [3–5]. It was predicted that diffraction patterns from single particles could be measured in “diffraction before destruction” experiments before the sample is destroyed by intense radiation [2, 6–9], and hence their damage-free structure could be discerned. Substantial

technological achievements have now made it possible to perform such measurements [10–13]. Together with recent algorithmic developments for data recognition and classification [14–17], orientation determination [18–23], and phase retrieval [24–26], these achievements have allowed for the advancement of the single-particle coherent x-ray diffraction imaging [12, 27] technique at XFELs from 2D applications for rather large samples [28, 29] towards 3D imaging of nanoscale objects [11–13]. However, the image resolution of reconstructed biological samples

demonstrated so far have been limited; thus, further theoretical and experimental efforts are needed to establish single-particle imaging (SPI) techniques at XFELs [30].

Alternative methods for structural characterization of bioparticles at XFELs are of great interest [31]. Serial femtosecond crystallography (SFX) at XFELs offers outstanding possibilities for structure determination of samples that can be crystallized [32, 33]. In contrast, the fluctuation x-ray scattering (FXS) technique [34, 35] aims to recover the structure of a single particle from a translationally and rotationally disordered ensemble of many reproducible particles by using pulse lengths below the particles' rotational diffusion times [34–40]. This technique is based on the analysis of angular cross-correlation functions (CCFs) from intensity fluctuations measured from a finite number of particles in the beam, yielding an information content far beyond what can be obtained using traditional small- and wide-angle scattering techniques. FXS is expected to be especially advantageous for weakly scattering objects that cannot be crystallized, and can potentially close the gap between SPI and SFX techniques, especially in the time-resolved domain [41, 42].

Recently, it has been demonstrated, that the FXS approach can be used to reconstruct the structure of an individual object from a 2D disordered ensemble of reproducible objects [43–45]. Unfortunately, an effective algebraic formalism of the CCFs developed for the 2D case [43] cannot be directly applied when particles can have arbitrary positions and orientations in 3D space. Therefore, additional assumptions or symmetry constraints are typically required to determine the 3D structure of a particle [38, 46–50]. A substantial theoretical advance in this direction has been recently achieved by demonstrating that single-particle electron density can be reconstructed from comparably limited FXS information by means of a multi-tiered iterative phasing (MTIP) algorithm [40]. MTIP is an extension of standard iterative phasing methods that concurrently recovers the real-space 3D structure and its reciprocal-space intensity directly from the FXS data, without applying symmetry constraints. In this Letter, we employed angular cross-correlations for model-based analysis as well as *ab initio* structure recovery using MTIP, for SPI data of aerosolized viruses measured at the Linac Coherent Light Source (LCLS).

We applied the FXS approach to single-particle scattering data, which can be considered the limiting case of a dilute solution with one particle in the x-ray beam [46–48]. The key idea to employ the CCFs for structure recovery is based on the fact that orientationally averaged CCFs preserve higher-order information about a 3D object as compared to conventional small-angle x-ray scattering (SAXS) [51, 52]. Here we applied the two-point CCF  $C_{ij}(q_1, q_2, \Delta) = \langle I_i(q_1, \varphi) I_j(q_2, \varphi + \Delta) \rangle_\varphi$  [34, 40, 47, 53–56], where  $q_k$  ( $k = 1, 2$ ) is the magnitude of the scattering vector,  $\Delta$  and  $\varphi$  are the angular coordinates,  $\langle \dots \rangle_\varphi$  defines angular average, and the subscripts

$i$  and  $j$  indicate that intensities  $I_i(q_k, \varphi)$  are correlated between the  $i$ -th and  $j$ -th diffraction patterns. For structural analysis, we used the difference spectrum [56],

$$\tilde{C}^n(q_1, q_2) = \langle C_{ii}^n(q_1, q_2) \rangle_i - \langle C_{ij}^n(q_1, q_2) \rangle_{i \neq j},$$

where  $C_{ii}^n(q_1, q_2)$  and  $C_{ij}^n(q_1, q_2)$  are the Fourier components (FCs) of the CCFs  $C_{ii}(q_1, q_2, \Delta)$  and  $C_{ij}(q_1, q_2, \Delta)$ , respectively, and  $\langle \dots \rangle_i$  and  $\langle \dots \rangle_{i \neq j}$  denote statistical averages over diffraction patterns (see Supplemental Material [57]). The difference FCs  $\tilde{C}^n(q_1, q_2)$  help to mitigate various systematic issues and improve the FXS data quality as compared to  $\langle C_{ii}^n(q_1, q_2) \rangle_i$  alone [38, 56, 58].

The experiment was carried out at the Atomic Molecular Optics (AMO) beamline [59] of LCLS [4]. The aerodynamic lens stack system [10] with a gas dynamic virtual nozzle [60] was employed to introduce single virus particles of  $\sim 70$  nm size into the focused XFEL beam of photon energy  $E = 1.6$  keV. The data used in the presented analysis were measured by a pair of pnCCD detectors with a resolution of 11.6 nm at the detector edge. A detailed description of the experimental setup and sample preparation can be found in ref. [61]. A large scattering dataset containing about three million diffraction patterns was filtered to select only high-intensity single hits with more than 4500 ADUs/pixel on average. These patterns were further classified according to the scattering particle size to minimize polydispersity effects (see [57] and [61] for preprocessing details). The resulting datasets with polydispersity  $PD = 3$  nm used in the following analysis contained 332 diffraction patterns from rice dwarf virus (RDV) particles, with size variation from 69 to 72 nm, and 566 patterns from PR772 bacteriophage particles, with size variation from 67.5 to 70.5 nm.

Experimental SAXS profiles,  $\langle I_i(q, \varphi) \rangle_{\varphi, i}$ , determined for RDV and PR772, together with their representative diffraction patterns, are shown in Figs. 1(a) and 1(b), respectively. The amplitudes of the ensemble-averaged FCs  $\tilde{C}^n(q, q) \equiv \tilde{C}^n(q)$  determined for the case  $q_1 = q_2 = q$  are shown in Figs. 1(c) and 1(d) for RDV and PR772, respectively. It can be readily shown that  $\langle I_i(q, \varphi) \rangle_{\varphi, i} = \langle I_i^0(q) \rangle_i$  and  $\tilde{C}^n(q) = \langle |I_i^n(q)|^2 \rangle_i$ , where  $I_i^n(q)$  are the angular FCs of scattered intensity [57]. Therefore, a combination of  $\langle I_i(q, \varphi) \rangle_{\varphi, i}$  and  $\tilde{C}^n(q)$  represents a generalized SAXS dataset, where the  $\tilde{C}^n(q)$  for  $n \neq 0$  can be considered as “higher-order SAXS” terms. Due to the small-angle scattering geometry of our experiment and the limited particle sizes, only six FCs of even orders  $n = 2, 4, 6, 8, 10$  and  $12$  make significant contribution to the Fourier spectrum of the CCFs [Figs. 1(c) and 1(d)], which clearly stand out from the background level formed by the degenerate FCs of odd orders  $n$ . Noticeable features in the spectra of RDV and PR772 suggest that two viruses have distinguishable features. However, the one-dimensional (1D) plots of  $\tilde{C}^n(q)$  contain only a small fraction of information accessible by the two-point

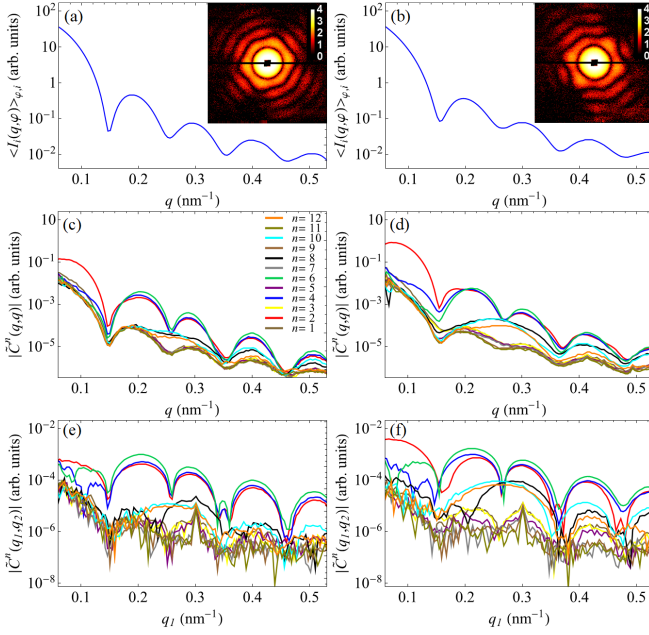


FIG. 1. (a,b) Experimental SAXS profiles  $\langle I_i(q, \varphi) \rangle_{\varphi, i}$  (log scale) determined for (a) RDV and (b) PR772 viruses. The insets in (a) and (b) display randomly chosen high-intensity single-particle diffraction patterns for corresponding particles. (c-f) Amplitudes of the FCs  $\tilde{C}^n(q_1, q_2)$  for  $n = 1, \dots, 12$  determined for (c,e) RDV and (d,f) PR772 viruses at (c,d)  $q_1 = q_2 = q$  and (e,f) at fixed  $q_2 = 0.3 \text{ nm}^{-1}$  as a function of  $q_1$ .

CCF. Clearly, one can determine the FCs  $\tilde{C}^n(q_1, q_2)$  also at different  $q_1$  and  $q_2$ , for instance as shown in Figs. 1(e) and 1(f). The full set of FCs  $\tilde{C}^n(q_1, q_2)$  consist of  $N_q$  such plots, where  $N_q$  is the sampling in the  $q$  direction.

The entire correlation dataset can be conveniently visualized in the form of 2D maps of  $\tilde{C}^n(q_1, q_2)$  for each FC of order  $n$  separately, as shown in Fig. 2. Importantly, these correlation maps comprise a fingerprint of the whole 3D structure of each virus and clearly indicate the differences between RDV and PR772, which are obvious even at the moderate resolution of the present experiment. We used these maps for comparison with simulated structures as well as for *ab initio* reconstruction of the virus structures.

Both RDV and PR772 are expected to possess an icosahedral-shaped capsid; therefore it is interesting to compare the determined correlation maps (Fig. 2) with the results of simulations for icosahedral particles. The 2D maps for the FC of order  $n = 2$  simulated for the RDV capsid atomic structure [62] [Protein Data Bank (PDB) entry 1UF2], as well as for several bead-model structures, are presented in Fig. 3. We focused our model-based comparison on the lowest even-order harmonic  $n = 2$  (see [57] for extended data), which typically can be associated with simple structural distortions like extension or compression, or anisotropic distribution of electron den-

sity in the particle. The first striking observation is that the simulated data for an icosahedral RDV capsid structure [Fig. 3(a)], determined to  $3.5 \text{ \AA}$  resolution by x-ray crystallography [62], look substantially different from our experimental result for RDV [Fig. 2(a)]. A general  $q$ -dependent misfit of the two maps can be explained by the fact that we observe scattering from a filled, instead of an empty, RDV capsid in our experiment. However, even a bead model of a solid icosahedral particle of  $71 \text{ nm}$  in size that gives the best fit to the experimental SAXS profile for RDV does not reproduce the respective experimental CCF data [compare Fig. 3(b) and 2(a)], which are more sensitive to structural features of the underlying scattering object. For instance, notice the difference between the results for a bead model of a solid particle [Fig. 3(b)] and a hollow icosahedral particle of the same size with a spherical void of a diameter  $d = 30 \text{ nm}$  [Fig. 3(c)].

We found that the similarity between the experimental and simulated correlation data increases if one applies a small distortion to the model capsid structure. The correlation map simulated for the empty RDV capsid compressed by about 3% (relative to the original size) along one of the five-fold symmetry axes [Fig. 3(d)] reveals characteristic features observed in the experimental map for RDV [Fig. 2(a)]. By applying a similar type of distortion (3% compression) to a solid icosahedral particle [Fig. 3(e)], we were able to reproduce the experimental result for RDV [Fig. 2(a)] very closely. A larger distortion (7% compression) applied to a solid icosahedral particle leads to the correlation map in Fig. 3(f), which closely resembles the experimental result for PR772 [Fig. 2(g)]. Note that the suggested compressions of the icosahedron give the virus particle an oblate character, which is supported by a generalized Guinier analyses [57, 63]. Clearly, correlation maps provide a detailed fingerprint of the whole 3D structure of a single object. In this case, we revealed structural features in RDV that correspond to only 3% (or about  $2 \text{ nm}$ ) of its overall size, which is much smaller than the experimental resolution (about  $12 \text{ nm}$  at the detector edge).

As compared to a 1D SAXS profile, correlation maps provide  $N_q \cdot n_{\text{tot}}$  (where  $n_{\text{tot}}$  is the total number of significant FCs of the CCF) times more measurements, which, in the present case, gives about two orders of magnitude increase in information content compared to SAXS. As in SAXS analysis, these data can be incorporated into a real-space model fitting procedure to recover the 3D structures [49]. Here we go beyond the uniform-density approximation employed in such models and perform *ab initio* reconstructions of the virus structures using the MTIP algorithm [40]. MTIP does not require solving the orientation-determination problem as is needed in conventional SPI techniques. Here we did not impose any symmetry constraints or model assumptions, apart from a finite support, during structure recovery [57]. The



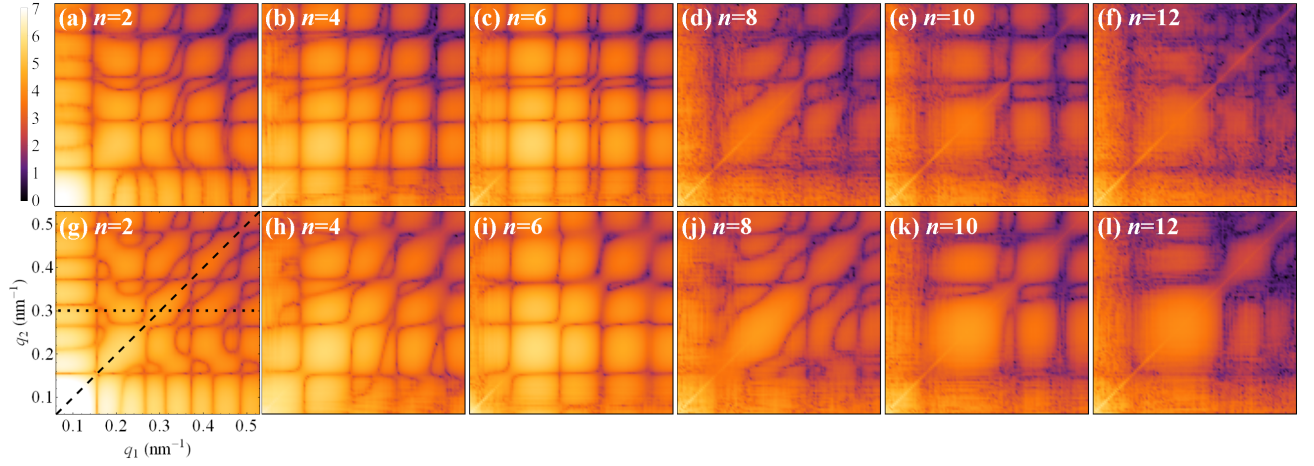


FIG. 2. Experimental 2D correlation maps (log scale, arb. units) of the amplitudes of the FCs  $|\tilde{C}^n(q_1, q_2)|$  for  $n = 2, 4, 6, 8, 10$  and  $12$ , determined for (a-f) RDV and (g-l) PR772 viruses. The legend and axes on the bottom-left map are the same for all 2D maps of the amplitudes  $|\tilde{C}^n(q_1, q_2)|$  in this paper. The dashed line ( $q_1 = q_2 = q$ ) in (g) indicates a section through all 2D maps for  $n \leq 12$ , which produce the plots in Figs. 1(c) and 1(d), while the dotted line corresponds to the plots in Figs. 1(e) and 1(f) for RDV and PR772, respectively.

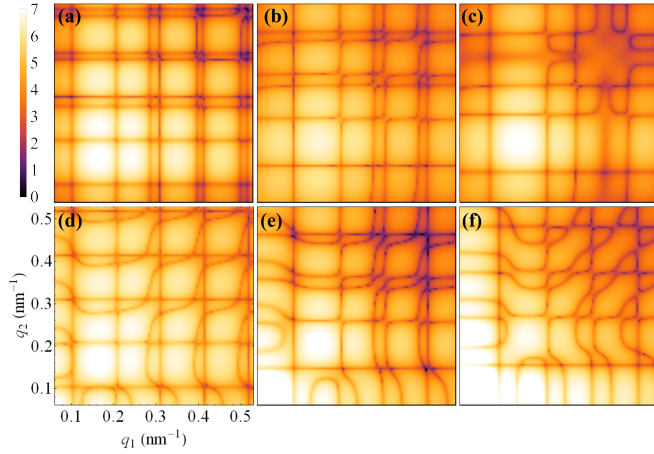


FIG. 3. Simulated 2D correlation maps (log scale, arb. units) of the amplitudes of the FCs  $|\tilde{C}^{n=2}(q_1, q_2)|$  for  $n = 2$  determined for (a) the atomistic structure of empty RDV capsid, and bead models of (b) solid icosahedral particle, (c) hollow icosahedral particle with a spherical void, (d) empty RDV capsid model compressed by 3% along the five-fold symmetry axis, (e,f) solid icosahedral particle compressed by (e) 3% and (f) 7% (see text). Notice prominent similarity of the simulated and experimental maps shown in Figs. 3(e) and 2(a), as well as Figs. 3(f) and 2(g).

recovered structures for RDV and PR772 (Fig. 4) show a mostly icosahedral capsid with minor distortions, consistent with the model analysis described above, as well as an anisotropic distribution of density inside the particles [64]. Note that, even though the internal distribution of material is unlikely to be perfectly reproducible, the internal density of the reconstructions is statistically relevant and can be viewed as an average over the inter-

nal heterogeneity. Resolution estimates were calculated using both a phase retrieval transfer function (PRTF) [65, 66] and Fourier shell correlations (FSC) [67–69] with the respective established cutoffs of  $1/e$  and  $0.5$ . We obtained resolutions of  $17.7$  nm for RDV and  $16.9$  nm for PR772 using the PRTF, and  $13.5$  nm for RDV and  $12.6$  nm for PR772 using the FSC [57].

Observed deviations of the particle structures from ideal icosahedral could have several origins. For one, there may be natural asymmetries in the RDV and PR772 structures, which is particularly relevant for the distribution of genetic material inside the viruses. Such information could be difficult to reveal in conventional crystallography, where information is averaged over all symmetry-equivalent orientations of the virus structure in a crystal, or in single-particle imaging techniques that enforce symmetry constraints. Another possibility is that particle distortions could potentially be induced during sample preparation or injection. For instance, particles might be covered with organic debris contained in the buffer, which stick to the virus particle while solution droplet evaporates during sample injection (see model results in [57]). While our *ab initio* reconstructions of virus structures support the idea that intrinsic structural features are incompatible with exact icosahedral symmetry, further systematic analysis is required to provide unambiguous interpretation of our observations. Irrespective of their origin, the observed structural features are statistically relevant, since the orientationally averaged correlation maps contain a fingerprint of the whole 3D structure, and are unhindered by polydispersity [57].

In this work, we outlined an efficient route for structural analysis of nanoscale objects at XFELs by means of angular cross-correlations, bridging the gap between

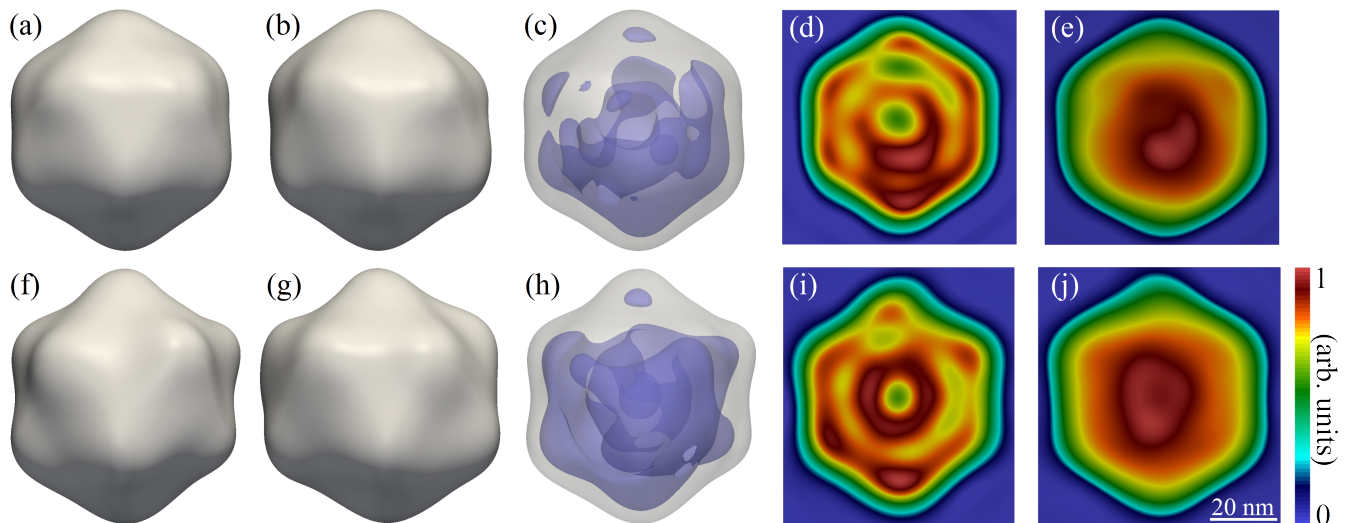


FIG. 4. Reconstructed images of RDV (top row) and PR772 (bottom row). Two different views (corresponding to a 72 degree rotation about the top axis) of the reconstructed RDV (a,b) and PR772 (f,g) particles, as well as density plots showing nonuniformities in the internal distribution of material inside the viruses (c, h), 2D slices through the center of the reconstructed densities (d,i), and 2D projections of the reconstructed densities (e,j). The isosurfaces for the capsid and internal material were calculated at 45% and 84% of the maximum density for RDV, and at 47% and 78% for PR772, respectively. The viewing directions for the 2D slices and projections in (d),(e), (i) and (j) are given by the normal to the page for the structures shown in (a), (b), (f) and (g), respectively.

conventional imaging and crystallography methods. We applied our approach to the scattering data from single aerosolized RDV and PR772 particles measured at LCLS and revealed nanoscale features of viruses, with deviations from icosahedral symmetry. We showed that CCFs preserve a substantial amount of structural information, which, in the present study, enabled observation of structural features of viruses at the nanometer scale. Overall, FXS generalizes the concept of small-angle scattering, yielding an increase in information content by several orders of magnitude. Moreover, appropriately constructed correlation maps comprise a fingerprint of the whole 3D structure of a scattering object and represent a valuable statistical tool for structural analysis. These 2D correlation maps can be especially useful to follow fast dynamical changes in the structure, for instance as a response to external stimulus [41, 42], which is a key component of structural studies at XFELs.

We demonstrated that angular cross-correlations represent an exceptional source of data for model-based comparison and *ab initio* structure recovery. Since these cross-correlations self-consistently characterize the whole 3D structure of an object, the problem of orientation determination typically encountered in conventional SPI algorithms can be omitted, which significantly improves the process of structure recovery. Analysis of polydispersity effects suggests that our approach can also be applied in the case of scattering from a system of multiple particles with some degree of polydispersity. This offers a fascinating opportunity to explore the full poten-

tial of the multiple-particle FXS technique to increase the resolution of the recovered structures and/or reduce radiation damage of biological species, going beyond the limits of conventional single-particle schemes.

Portions of this research were carried out at the LCLS at the SLAC National Accelerator Laboratory. The LCLS is supported by the US Department of Energy (DOE), Office of Science, Office of Basic Energy Sciences (OBES), under contract DE-AC02-76SF00515. This work was supported by the European Research Council, “Frontiers in Attosecond X-ray Science: Imaging and Spectroscopy (AXSIS)”, ERC-2013-SyG 609920. This work was also supported by the Swedish Research Council, the Knut and Alice Wallenberg Foundation, the European Research Council, the Röntgen Ångström Cluster, the Swedish Foundation for International Cooperation in Research and Higher Education (STINT), and the Swedish Foundation for Strategic Research. This work was supported by the OBES through the AMOS program within the CSGB and by the DOE through the SLAC Laboratory Directed Research and Development Program. It was also supported by the joint Stanford ChEM-H and SLAC National Accelerator Laboratory seed grant program. Part of this work was supported by the NSF Science and Technology Centers grant NSF-1231306 (“Biology with X-ray Lasers”, BioXFEL), NIH grant R01GM095583. This work was supported by the Australian Research Council Centre of Excellence in Advanced Molecular Imaging (CE140100011) [www.imagingcoe.org](http://www.imagingcoe.org) Portions of this research were car-

ried out at Brookhaven National Laboratory, operated under Contract No. DE-SC0012704 from the U.S. Department of Energy (DOE) Office of Science. This research was supported in part by the Advanced Scientific Computing Research and the Basic Energy Sciences programs and used resources of the National Energy Research Scientific Computing Center, which are supported by the Office of Science of the US Department of Energy under Contract DE-AC02-05CH11231. Further support originated from the National Institute of General Medical Sciences of the National Institutes of Health under Award R01GM109019. The content of this article is solely the responsibility of the authors and does not necessarily represent the official views of the National Institutes of Health.

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\* ruslan.kurta@xfel.eu

† jjdonatelli@lbl.gov

‡ yoon82@stanford.edu

§ phzwart@lbl.gov

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