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## Supporting information for

## 2 On the role of pore constrictions in gas diffusion electrodes

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16 This file contains: Methods and Supplementary Figures 1-4

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## 18 Methods

19 **Sample preparation:** A detailed description of the MPL fabrication is described in Refs 1 and 2 for the Li100 and VGCF respectively. The evaluated MPLs consist of 20 wt-% PTFE binder 20 21 (Dispersion: TF 5035GZ from 3 M Dyneon) and 80 wt-% to two different types of carbon: a 22 conventionally used high surface area carbon black, referred to as Li100 (from Denka, Japan; 23 specifications: BET surface area =  $68 \text{ m}^2/\text{g}$ , average particle size = 35 nm), and vapor grown carbon 24 fibers, referred to as VGCF (from Showa Denko; specifications: BET surface area = 13  $m^2/g$ , fiber length =  $10-20 \mu m$ , fiber diameter = 150 nm). To create an MPL slurry, the carbon powder and 25 26 PTFE dispersion were mixed with water (Milli-Q,  $18M\Omega$ ) as a solvent, methyl cellulose (Sigma-27 Aldrich) as thickener, and Triton X-100 (Sigma Aldrich) as an emulsifier. The slurry was coated 28 on a Freudenberg H14 (PTFE treated) gas diffusion layer substrate (GDL-S) using a doctor blade 29 and a stainless steel stencil. For mercury intrusion analysis, the MPL slurry was coated on a glass 30 plate from where it could be removed as a freestanding MPL layer. The final MPL/GDL-S combinations or the freestanding MPLs were subject to a heat-treatment procedure as described in 31 32 reference<sup>1</sup>.

33 Embedding of both samples was accomplished by atomic layer deposition (ALD) of zinc oxide 34 with a BENEQ TFS200 instrument. Diethyl zinc (DEZ) and H<sub>2</sub>O were used as precursors, the 35 chamber temperature was set at 200°C, while the precursors were not pre-heated. Refractometer characterization revealed that a ZnO layer of ~ 100 nm was deposited on the sample surface, with 36 37 the layer thickness decreasing by going into the sample. A penetration depth of 20 µm was reached. The deposition consisted of 1000 cycles, with pulse duration of 600 ms for both  $H_2O$  and DEZ, 38 39 with 900 ms waiting time after each pulse, and a purge time of 3 s. Ilion II by Gatan was used for 40 the argon beam surface polishing, using a 4 keV argon beam in dual beam cross section polishing

41 mode.

42 FIB/SEM microscopy: ZEISS CrossBeam 540 FIB-SEM equipped with Atlas 5 tomography 43 software was used for volume acquisition. Milling conditions for the focused ion beam were 30 44 keV and 700 pA, while scanning electron beam parameters were 1.5 keV and 500 pA. The Voxel 45 size was 8 nm for Li100 MPL and 10 nm for VGCF MPL. Tilt correction by Atlas 5 was applied 46 to obtain isotropic voxels.

Image processing: Volume reconstruction and segmentation for Li100 was entirely done with Fiji, 47 using the WEKA machine learning tool included in ImageJ<sup>3</sup>. For the VGCF MPL, stack registration 48 49 and volume reconstruction were performed with Fiji and the alignment of the slices was performed using three FIB-milled notches on the top surface of the sample. A pixel classifier based on deep 50 learning, YAPiC Python toolbox, was used to segment the fibers from the pores. One in a hundred 51 52 z-sections was selected for the training, that consisted of manual annotations using the QuPath software for ground truth data<sup>4</sup>, and a U-Net (2D) architecture<sup>5</sup>, with minibatch-wise normalization, 53 data augmentation by rotating and flipping, 20% validation and 50 training steps per epochs. For 54 both the MPL, local thickness plugin included in Bonej library<sup>6,7</sup> was used to extract the pore size 55 distribution, while flow-based tortuosity was obtained with TauFactor MATLAB application<sup>8</sup>. 56

57 Hand thresholding was performed several times on the thickness distribution of each volume, and 58 threshold values were chosen in order to have enough points distributed between the unthresholded 59 pore network and the loss of percolation value. Once the hand thresholding was performed on both 60 volumes to cut off the constrictions, *find connected regions* ImageJ plugin was then used to extract 61 the largest connected pores domain at each step. The plots in Fig. 3 are built up from the volumes 62 displayed in Fig. 2a-b as well as the volumes displayed in Fig. S4. Unlike Fig. 2c, that shows each 63 volume data separately, datapoints of Fig. 3 were obtained by a weighted average among the 64 different volumes, using the volume size as weight.

Mercury Intrusion Porosimetry: Measurements were carried out on the Autopore Instrument 65 66 (9600, Micromeritics Instrument Corporation, USA). Freestanding MPL samples (~80-120mg) were cut to small pieces (1cm x 2.5 cm) and inserted in the penetrometer (sample holder) comprised of 67 68 5 mL head and 0.392 mL stem volume, which resulted to a stem usage of 60-75%. The pressure range from vacuum to 45 psia was measured in horizontal penetrometer positioning, while the 69 range from 45-61000 psia was measured in the high pressure port in vertical penetrometer position. 70 71 The pressure was increased to achieve a spacing of 25 points per decade on a logarithmic scale. The pressure p was converted to a pore diameter  $d_{pore}$  via Washburn's equation: 72

$$d_{pore} = -\frac{4 \cdot \gamma_{Hg} \cos \theta}{p}$$

with the surface tension of mercury  $\gamma_{Hg}$  (0.480 N/m) and the contact angle  $\theta$  (140°). To compare the cumulative intrusion with the tomography results, pores larger than 524 nm and 2119 nm were omitted for the Li100 and VGCF MPL, respectively.

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108 **Figure S1**:  $H_2/air$  performance of the L100 and the VGCF MPLs obtained in a 5 cm<sup>2</sup> single-cell PEM fuel 109 cell under high-RH operating conditions (differential  $H_2/air$  flows (2000/5000 nccm) at a cell temperature 110 of 50 °C, a relative humidity of 120 %, and an inlet pressure of 300 kPa<sub>abs</sub>; obtained with a Gore MEA with 111 an 18 µm membrane and anode/cathode loadings of 0.1/0.4 mg<sub>Pt</sub>/cm<sup>2</sup>). The here shown data were taken 112 from Simon *et al.*<sup>1</sup> for the Li100 data, and from Simon *et al.*<sup>2</sup> for the VGCF data. For both the samples, the 113 MPL thickness was 30 µm coated onto the same GDL-S.

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Figure S2: a) Li100 left half of the volume analysed in the manuscript and b) VGCF left half of the volume analysed in the manuscript, corresponding right halves are c) and d). Pore size distributions of the two e) Li100 halves and f) VGCF halves show good consistency, as well as g) porosity and tortuosity values. Looking at size parameters, h) the average pore size for Li100 sub-volumes are 150 nm and 160 nm, while

121 for VGCF they are 770 nm and 780 nm, while the mode values are 140 nm and 130 nm for the Li100 stacks,

- 122 400 nm and 320 nm for the VGCF stacks.
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125 Figure S3: X-CT scans of a) Li100 MPL and b) VGCF MPL. The VGCF MPL porosity value is more

126 affected by compression and therefore only the central (uncompressed) region was taken into account. c)

127 Porosity values of 0.77 for Li100 and 0.80 for VGCF with relative uncertainties of 0.08 and 0.03 were

<sup>128</sup> evaluated.



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- 130 Figure S4: FIB-SEM reconstructed volumes of Li100 MPLs for sample volumes 1 (a) and 2 (b), and of
- 131 VGCF MPLs for sample volumes 1 (c) and 2 (d). e) Porosity and tortuosity plot illustrating the consistency 132 with the volumes shown in the main menuscript
- 132 with the volumes shown in the main manuscript.