M. Arpogaus, M. Voss, B. Sick, M. Nigge-Uricher und O. Dürr, "Short-Term Density Forecasting of Low-Voltage Load using Bernstein-Polynomial Normalizing Flows," *IEEE Transactions on Smart Grid*, doi: 10.1109/TSG.2023.3254890, 2023.

Short-Term Density Forecasting of Low-Voltage Load using Bernstein-Polynomial Normalizing Flows

Marcel Arpogaus, Marcus Voss, Beate Sick, Mark Nigge-Uricher and Oliver Durr



CER - Data set

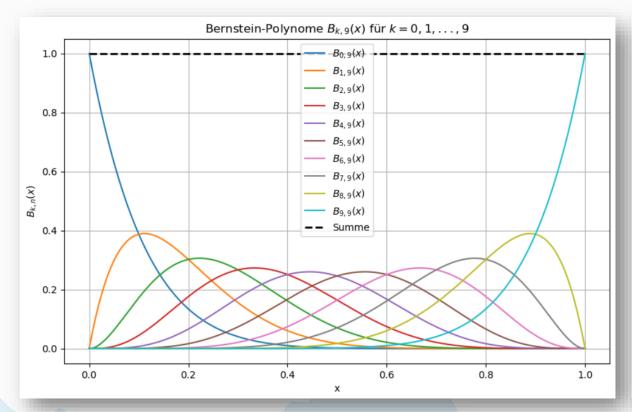
Data from smartmeters in private households (N = 3639)

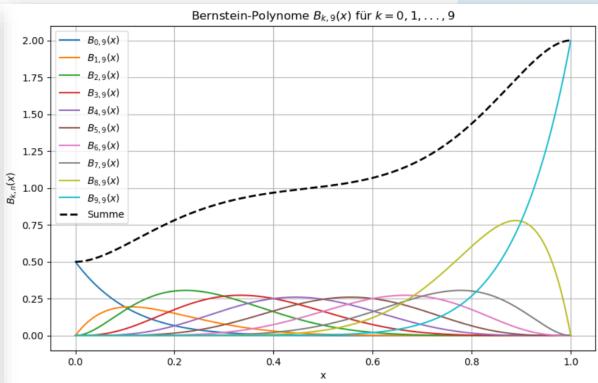
Period: 14.07.09 - 31.12.10

Resolution: Sample every 30min

Quelle: https://www.smarter-fahren.de/smart-grid-fuer-elektroautos/

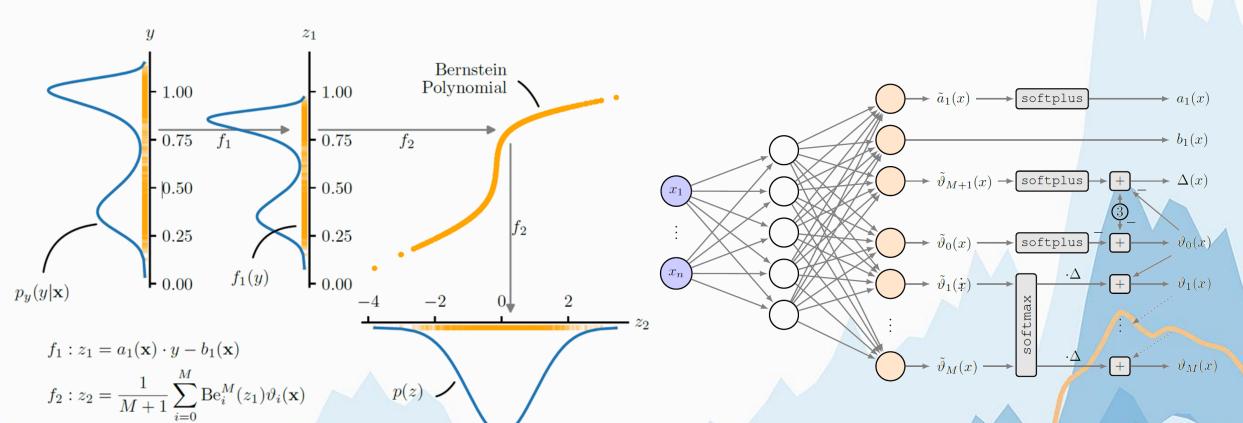
Bernstein-Polynomials





Quelle: eigene Abbildungen

Normalizing Flows using Bernstein-Polynomials



— (transformed) distribution — (transformed) samples

Quelle: Arpogaus et al., IEEE Trans. Smart Grid, 2023, doi: 10.1109/TSG.2023.3254890

Comparison of Models

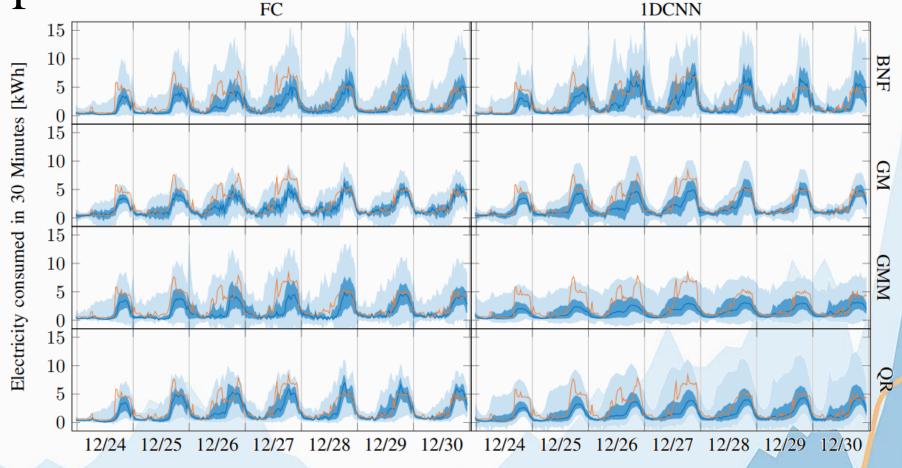


Fig. 5. The plots show the 98% () and 60% () confidence intervals, along with the median () of the predicted CPD and the measured observations () for one household with unusual high load during the Christmas week. Data from [45].

Quelle: Arpogaus et al., IEEE Trans. Smart Grid, 2023, doi: 10.1109/TSG.2023.3254890

Comparison of Models

$N_{ m train}$	NN	kind Distribution	NLL	NCRPS [%]	NMQS [%]
363	Baseline	ECDF	-111.702	1.920	1.900
	FC	BNF	-135.616 (±0.388)	1.502 (± 0.007)	1.486 (±0.007)
		GMM	$-129.663 \ (\pm 0.642)$	$1.542 \ (\pm 0.008)$	$1.526 \ (\pm 0.008)$
		GM	$-100.973 \ (\pm 0.893)$	$1.743 \ (\pm 0.015)$	$1.724\ (\pm0.014)$
		QR	_	_	$2.303 \ (\pm 0.587)$
	1DCNN	BNF	-137.040 (\pm 1.640)	1.495 (± 0.017)	1.479 (±0.016)
		GMM	$-132.622 \ (\pm 0.560)$	$1.613 \ (\pm 0.017)$	$1.596 \ (\pm 0.017)$
		GM	$-100.040 \ (\pm 0.408)$	$1.742 \ (\pm 0.011)$	$1.724 (\pm 0.011)$
		QR	_	_	$1.625\ (\pm0.006)$
1091	Baseline	ECDF	-114.777	1.886	1.867
	FC	BNF	$-139.262 \ (\pm 0.361)$	1.443 (± 0.009)	$1.428 \ (\pm 0.009)$
		GMM	$-135.029 (\pm 0.754)$	$1.464\ (\pm0.009)$	$1.449 \ (\pm 0.009)$
		GM	$-104.128 \ (\pm 0.402)$	$1.660 \ (\pm 0.010)$	$1.642 \ (\pm 0.010)$
		QR	_	-	1.393 (± 0.003)
	1DCNN	BNF	$-142.385\ (\pm0.904)$	1.426 (± 0.011)	1.411 (±0.011)
		GMM	-135.767 (±0.692)	$1.541 \ (\pm 0.015)$	$1.525 (\pm 0.014)$
		GM	$-103.335 (\pm 1.027)$	$1.659 \ (\pm 0.022)$	$1.641 \ (\pm 0.021)$
		QR	- /	_	1.400 (±0.008)

Quelle: Arpogaus et al., IEEE Trans. Smart Grid, 2023, doi: 10.1109/TSG.2023.3254890