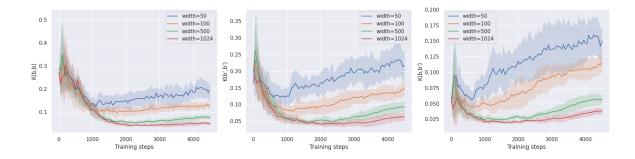
Online Limited Memory Neural-Linear Bandits with Likelihood Matching -Supplementary Material

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A. Representation drift experiment

The NTK was sampled during training with the Shuttle Statlog dataset (Newman et al., 2008). We compute the NTK for two fixed contexts b and b', taken from the dataset. Each context is composed of 9 features describing the space shuttle flight. The goal is to predict the state of the radiator of the shuttle (the reward). There are N = 7 possible actions; for correct predictions the reward is r = 1 and r = 0 otherwise.

The weights of the network were initialized according to (Jacot et al., 2018). We ran the experiments for various network widths: 50, 100, 500, and 1024. The network was trained as described in the main paper (Method and setup) with a random policy. The NTK was sampled every 50 iterations during training for the estimated reward of the first action. The graphs below present K(b, b), K(b', b') and K(b, b') from left to right accordingly during training averaged over 10 seeds.



B. Raw results

			Full memory		Limited memory			NTK based		
Name	d	А	LinearTS	NeuralLinear	LiM2 (Ours)	NeuralLinear-MM	NeuralLinear-Naive	NeuralUCB	NeuralTS	NeuralLinear-NTK
Mushroom	117	2	11162 ± 1167	10810 ± 428	9880 ± 1776	4602 ± 1408	4843 ± 1228	-32 ± 3	-34 ± 18	9785 ± 1012
Financial	21	8	3752 ± 8	3560 ± 12	$\textbf{3762} \pm \textbf{18}$	2802 ± 21	2726 ± 23	1116 ± 824	876 ± 595	3610 ± 18
Jester	32	8	$\textbf{15944} \pm \textbf{170}$	14731 ± 304	14926 ± 571	11940 ± 1307	11647 ± 1066	13397 ± 7	13397 ± 8	14642 ± 200
Adult	88	2	4008 ± 14	4003 ± 12	4043 ± 15	3483 ± 33	3477 ± 16.5	3768 ± 2	3769 ± 2	3990 ± 17
Covertype	54	7	2961 ± 25	2742 ± 40	2719 ± 62	2241 ± 30	2272 ± 37	1870 ± 11	1877 ± 83	2708 ± 31
Census	377	9	1801 ± 15	2510 ± 21	2827 ± 22	2099 ± 39	2114 ± 34	2019 ± 94	1926 ± 76	2517 ± 42
Statlog	9	7	4460 ± 19	4729 ± 6	4820 ± 68	4545 ± 34	4476 ± 19	4075 ± 3	4348 ± 265	4722 ± 12
Epileptic	178	5	1204 ± 29	1734 ± 46	1501 ± 115	1411 ± 30	1368 ± 26	1010 ± 2	1011 ± 2	1431 ± 47
Smartphones	561	6	3092 ± 18	4208 ± 23	4313 ± 46	2647 ± 17	2626 ± 16	2214 ± 1548	3166 ± 1113	4191 ± 32
Scania Trucks	170	2	4710 ± 171	4837 ± 132	4856 ± 111	4574 ± 220	4650 ± 103	4919 ± 19	4922 ± 23	4730 ± 179
Amazon	7K	5	-	3024 ± 25	3052 ± 160	2793 ± 41	2804 ± 41	-	-	3014 ± 37

Table 1. Cumulative reward on 11 real world datasets.

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