Cross-temporal Probabilistic Forecast Reconciliation: online appendix

February 2, 2023

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	Base forecasts' sample approach								
Reconciliation approach		Gaussia	an framev	works: sh	rinkage c	ovariance	matrix		Bootstra
approach]	[n-sample]	e residual	\mathbf{s}	1	Multi-ste	p residual	ls	Dootstra
	G	В	Н	HB	G	В	Н	$^{\mathrm{HB}}$	
				$\forall k \in \{2, 1\}$	1}				
base	1.000	1.002	1.036	1.038	0.990	0.992	0.994	0.996	0.993
$\operatorname{ct}(bu)$	0.922	0.922	0.922	0.922	0.893	0.893	0.894	0.893	0.895
$\operatorname{ct}(shr_{cs},bu_{te})$	0.922	0.921	0.922	0.921	0.892	0.893	0.893	0.893	0.894
$\operatorname{ct}(wlsv_{te}, bu_{cs})$	0.923	0.923	0.931	0.931	0.908	0.909	0.910	0.909	0.903
oct(wlsv)	0.935	0.937	0.944	0.945	0.922	0.923	0.924	0.923	0.915
oct(bdshr)	0.923	0.923	0.931	0.931	0.908	0.909	0.910	0.909	0.903
oct(shr)	0.986	0.975	0.973	0.966	0.895	0.895	0.896	0.896	0.934
oct(bshr)	0.987	0.990	0.976	0.978	0.914	0.915	0.915	0.915	0.944
oct(hshr)	0.987	0.986	1.028	1.018	0.964	0.964	0.967	0.967	0.979
oct(hbshr)	0.988	0.989	1.017	1.020	0.977	0.978	0.980	0.981	0.980
$\operatorname{oct}_h(shr)$	0.922	0.921	0.925	0.925	0.895	0.895	0.896	0.896	0.897
$\operatorname{oct}_h(bshr)$	0.941	0.944	0.944	0.946	0.914	0.915	0.915	0.915	0.916
$\operatorname{oct}_h(hshr)$	0.975	0.975	1.004	1.004	0.964	0.964	0.967	0.967	0.967
$\operatorname{oct}_h(hbshr)$	0.988	0.989	1.017	1.020	0.977	0.978	0.980	0.981	0.980
, , , ,				k = 1					
base	1.000	1.002	1.000	1.002	0.981	0.983	0.982	0.983	0.983
$\operatorname{ct}(bu)$	0.978	0.978	0.978	0.977	0.960	0.960	0.961	0.960	0.961
$\operatorname{ct}(shr_{cs},bu_{te})$	0.977	0.977	0.977	0.977	0.959	0.960	0.960	0.959	0.961
$\operatorname{ct}(wlsv_{te},bu_{cs})$	0.986	0.986	0.987	0.986	0.975	0.976	0.977	0.976	0.970
$\cot(wlsv)$	0.998	0.998	0.998	0.999	0.989	0.990	0.990	0.990	0.981
oct(bdshr)	0.985	0.985	0.986	0.986	0.975	0.976	0.976	0.976	0.970
oct(shr)	1.058	1.047	1.044	1.038	0.962	0.962	0.963	0.962	1.019
oct(bshr)	1.053	1.054	1.042	1.044	0.980	0.982	0.982	0.981	1.024
oct(bshr)	1.072	1.074	1.096	1.087	1.032	1.033	1.035	1.035	1.062
oct(hbshr)	1.062	1.063	1.071	1.072	1.045	1.046	1.048	1.049	1.047
$\operatorname{oct}_h(shr)$	0.979	0.979	0.980	0.980	0.962	0.962	0.963	0.962	0.964
$\operatorname{oct}_h(shr)$	0.999	1.001	1.000	1.001	0.980	0.982	0.982	0.902 0.981	0.982
$\operatorname{oct}_h(bshr)$	1.049	1.049	1.057	1.057	1.032	1.033	1.035	1.035	1.035
$\operatorname{oct}_h(hbshr)$	1.062	1.063	1.071	1.072	1.045	1.046	1.048	1.049	1.047
1	0.000	1 001	1.070	k=2	0.000	1 001	1.007	1.010	1.000
base	0.999	1.001	1.073	1.076	0.999	1.001	1.007	1.010	1.002
$\operatorname{ct}(bu)$	0.870	0.870	0.870	0.870	0.830	0.831	0.831	0.831	0.832
$\operatorname{ct}(shr_{cs},bu_{te})$	0.870	0.869	0.870	0.869	0.830	0.831	0.831	0.831	0.832
$\operatorname{ct}(wlsv_{te}, bu_{cs})$	0.864	0.864	0.880	0.879	0.846	0.847	0.847	0.847	0.841
oct(wlsv)	0.877	0.879	0.893	0.894	0.860	0.861	0.861	0.861	0.853
oct(bdshr)	0.865	0.864	0.880	0.879	0.846	0.846	0.847	0.847	0.841
$\operatorname{oct}(shr)$	0.919	0.908	0.907	0.899	0.833	0.833	0.834	0.834	0.855
oct(bshr)	0.926	0.930	0.913	0.916	0.852	0.853	0.853	0.853	0.871
oct(hshr)	0.908	0.906	0.964	0.953	0.900	0.901	0.903	0.903	0.903
oct(hbshr)	0.918	0.921	0.966	0.970	0.913	0.915	0.917	0.918	0.916
$\operatorname{oct}_h(shr)$	0.869	0.866	0.873	0.873	0.833	0.833	0.834	0.834	0.835
$\operatorname{oct}_h(bshr)$	0.887	0.891	0.891	0.895	0.852	0.853	0.853	0.853	0.854
$\operatorname{oct}_h(hshr)$	0.906	0.906	0.954	0.953	0.900	0.901	0.903	0.903	0.904
$\operatorname{oct}_h(hbshr)$	0.918	0.921	0.966	0.970	0.913	0.915	0.917	0.918	0.916

Table 1: CRPS skill score presented in equation (18) and (19) of the paper. The smaller this value, the more accurate the forecast. Approaches that performed worse than the benchmark model (base, G) are highlighted in red, the best for each column is marked in bold and in blue the lowest value. The notation used to refer to the reconciliation and base forecast samples is explained in more details in Section 7.1 of the paper.

	Base forecasts' sample approach									
Reconciliation approach	Gaussian frameworks: shrinkage covariance matrix								Bootstrap	
approach]	[n-sample	e residual	s	1	Multi-step	residual	s	Dootstrap	
	G	В	Η	$_{ m HB}$	G	В	Η	$^{\mathrm{HB}}$		
	$\forall k \in \{2, 1\}$									
base	0.999	1.003	1.033	1.040	0.991	0.994	0.995	0.997	0.995	
$\operatorname{ct}(bu)$	0.918	0.918	0.918	0.918	0.890	0.891	0.892	0.892	0.892	
$\operatorname{ct}(shr_{cs},bu_{te})$	0.918	0.917	0.917	0.918	0.891	0.890	0.890	0.890	0.891	
$\operatorname{ct}(wlsv_{te}, bu_{cs})$	0.919	0.919	0.927	0.927	0.905	0.906	0.906	0.906	0.901	
$\cot(wlsv)$	0.930	0.932	0.939	0.940	0.917	0.919	0.918	0.918	0.911	
oct(bdshr)	0.919	0.919	0.927	0.926	0.905	0.906	0.906	0.906	0.901	
$\operatorname{oct}(shr)$	0.983	0.972	0.970	0.963	0.893	0.893	0.893	0.893	0.933	
$\cot(bshr)$	0.985	0.988	0.973	0.976	0.910	0.910	0.910	0.910	0.942	
$\cot(hshr)$	0.981	0.979	1.018	1.009	0.958	0.958	0.961	0.961	0.973	
$\operatorname{oct}(hbshr)$	0.980	0.981	1.007	1.010	0.968	0.971	0.972	0.973	0.972	
$\operatorname{oct}_h(shr)$	0.918	0.917	0.920	0.920	0.892	0.893	0.893	0.893	0.895	
$\operatorname{oct}_h(bshr)$	0.936	0.938	0.937	0.940	0.908	0.910	0.910	0.910	0.911	
$\operatorname{oct}_h(hshr)$	0.969	0.970	0.996	0.996	0.958	0.959	0.961	0.961	0.962	
$\operatorname{oct}_h(hbshr)$	0.980	0.981	1.007	1.010	0.968	0.971	0.972	0.972	0.973	
,				k = 1						
base	1.000	1.004	1.000	1.004	0.983	0.985	0.983	0.984	0.986	
$\operatorname{ct}(bu)$	0.970	0.970	0.970	0.970	0.954	0.954	0.956	0.955	0.955	
$\operatorname{ct}(shr_{cs},bu_{te})$	0.969	0.968	0.969	0.969	0.953	0.953	0.952	0.952	0.954	
$\operatorname{ct}(wlsv_{te},bu_{cs})$	0.977	0.978	0.979	0.978	0.969	0.969	0.969	0.969	0.963	
oct(wlsv)	0.988	0.990	0.989	0.990	0.980	0.981	0.980	0.982	0.975	
oct(bdshr)	0.977	0.977	0.978	0.977	0.967	0.969	0.970	0.968	0.963	
$\cot(shr)$	1.050	1.040	1.036	1.030	0.956	0.956	0.956	0.956	1.014	
$\operatorname{oct}(\overrightarrow{bshr})$	1.046	1.048	1.035	1.037	0.972	0.972	0.973	0.971	1.019	
$\cot(hshr)$	1.061	1.061	1.080	1.073	1.021	1.022	1.025	1.023	1.051	
$\operatorname{oct}(hbshr)$	1.049	1.050	1.056	1.058	1.032	1.034	1.035	1.035	1.035	
$\operatorname{oct}_h(shr)$	0.970	0.971	0.972	0.972	0.955	0.955	0.956	0.955	0.957	
$\operatorname{oct}_h(bshr)$	0.989	0.990	0.989	0.991	0.971	0.973	0.973	0.972	0.974	
$\operatorname{oct}_h(hshr)$	1.039	1.039	1.044	1.044	1.022	1.022	1.024	1.024	1.025	
$\operatorname{oct}_h(hbshr)$	1.048	1.050	1.056	1.059	1.031	1.033	1.035	1.037	1.036	
				k = 2						
base	0.999	1.002	1.067	1.076	0.998	1.002	1.006	1.011	1.003	
$\operatorname{ct}(bu)$	0.870	0.869	0.869	0.869	0.831	0.832	0.833	0.833	0.834	
$\operatorname{ct}(shr_{cs},bu_{te})$	0.870	0.869	0.869	0.869	0.833	0.831	0.832	0.832	0.832	
$\operatorname{ct}(wlsv_{te}, bu_{cs})$	0.864	0.864	0.878	0.878	0.846	0.848	0.848	0.848	0.842	
oct(wlsv)	0.876	0.877	0.892	0.892	0.859	0.860	0.860	0.859	0.852	
$\operatorname{oct}(bdshr)$	0.865	0.864	0.879	0.877	0.846	0.847	0.847	0.847	0.842	
$\cot(shr)$	0.921	0.910	0.908	0.901	0.833	0.835	0.834	0.835	0.859	
$\operatorname{oct}(bshr)$	0.927	0.931	0.915	0.918	0.852	0.852	0.852	0.852	0.871	
oct(hshr)	0.907	0.904	0.960	0.949	0.899	0.899	0.901	0.903	0.900	
$\operatorname{oct}(hbshr)$	0.915	0.917	0.960	0.964	0.908	0.912	0.912	0.914	0.913	
$\operatorname{oct}_h(shr)$	0.869	0.866	0.872	0.872	0.833	0.834	0.835	0.835	0.837	
$\operatorname{oct}_h(bshr)$	0.885	0.889	0.889	0.892	0.849	0.851	0.851	0.851	0.853	
$\operatorname{oct}_h(hshr)$	0.904	0.906	0.950	0.950	0.899	0.899	0.901	0.902	0.903	
$\operatorname{oct}_h(hbshr)$	0.915	0.917	0.961	0.964	0.908	0.912	0.913	0.912	0.913	

Table 2: ES skill score presented in equation (18) and (19) of the paper. The smaller this value, the more accurate the forecast. Approaches that performed worse than the benchmark model (base, G) are highlighted in red, the best for each column is marked in bold and in blue the lowest value. The notation used to refer to the reconciliation and base forecast samples is explained in more details in Section 7.1 of the paper.

B AusGDP

	Base forecasts' sample approach						
Reconciliation	Gaussian frameworks: shrinkage covariance matrix						
approach			o residuals		ping and		
F F	Воотытар			_	residuals		
		G	Н	G	Н		
		$\forall k \in \{4, 2$	$,1$ }				
base	1.000	0.979	1.011	0.968	0.987		
$\operatorname{ct}(shr_{cs},bu_{te})$	0.937	0.960	0.961	0.962	0.960		
$\operatorname{ct}(wls_{cs},bu_{te})$	0.930	0.951	0.953	0.911	0.915		
$\operatorname{oct}_o(wlsv)$	0.926	0.961	0.948	0.914	0.912		
$oct_o(bdshr)$	0.978	0.956	0.949	0.949	0.934		
$\operatorname{oct}_o(shr)$	0.950	0.957	0.946	0.933	0.917		
$\operatorname{oct}_o(hshr)$	0.989	0.997	1.013	0.967	0.982		
$\operatorname{oct}_{oh}(shr)$	1.102	1.010	1.006	1.051	0.995		
$\operatorname{oct}_{oh}(hshr)$	1.006	0.989	1.004	0.979	1.002		
		k = 1					
base	1.000	0.988	0.988	0.971	0.971		
$\operatorname{ct}(shr_{cs}, bu_{te})$	0.992	1.001	1.001	1.004	1.000		
$\operatorname{ct}(wls_{cs},bu_{te})$	0.986	0.997	0.998	0.964	0.967		
$oct_o(wlsv)$	0.984	1.000	0.993	0.966	0.965		
$\operatorname{oct}_o(bdshr)$	1.034	0.984	0.983	0.988	0.977		
$\operatorname{oct}_o(shr)$	1.014	0.998	0.995	0.986	0.974		
$oct_o(hshr)$	1.047	1.039	1.054	1.019	1.032		
$\operatorname{oct}_{oh}(shr)$	1.172	1.059	1.063	1.105	1.058		
$\operatorname{oct}_{oh}(hshr)$	1.068	1.037	1.050	1.034	1.053		
()		k = 2					
base	1.000	0.984	1.009	0.968	0.987		
$\operatorname{ct}(shr_{cs},bu_{te})$	0.949	0.972	0.972	0.974	0.971		
$\operatorname{ct}(wls_{cs},bu_{te})$	0.942	0.962	0.964	0.923	0.927		
$oct_o(wlsv)$	0.938	0.976	0.959	0.927	0.925		
$oct_o(bdshr)$	0.991	0.970	0.963	0.963	0.948		
$oct_o(shr)$	0.965	0.973	0.959	0.948	0.931		
$oct_o(hshr)$	1.002	1.013	1.026	0.980	0.996		
$oct_{oh}(shr)$	1.120	1.026	1.019	1.070	1.010		
$\operatorname{oct}_{oh}(hshr)$	1.021	1.005	1.017	0.993	1.017		
occon (non)	1.021	k=4	1.011	0.550	1.011		
base	1.000	$\kappa = 4$ 0.966	1.037	0.964	1.002		
$\operatorname{ct}(shr_{cs},bu_{te})$	0.874	0.910	0.911	0.910	0.910		
		0.897	0.911	0.851			
$\operatorname{ct}(wls_{cs}, bu_{te})$ $\operatorname{oct}_o(wlsv)$	0.866 0.860	0.910	0.894	0.851	$0.855 \\ 0.852$		
$oct_o(wist)$ $oct_o(bdshr)$	0.914	0.910 0.917	0.894 0.905	0.899	0.832 0.880		
$\cot_o(shr)$	0.914 0.877	0.917	0.905 0.886	0.899 0.868	0.850		
$\operatorname{oct}_o(shr)$	0.877 0.922	0.903 0.943	0.962	0.905	0.921		
$\operatorname{oct}_{oh}(shr)$	$\frac{0.922}{1.020}$	0.945 0.947	0.932 0.939	0.981	0.921 0.922		
$\operatorname{oct}_{oh}(shr)$	0.934	0.947 0.929	0.946	0.931	0.922 0.937		

Table 3: CRPS skill score presented in equation (18) and (19) of the paper for the Australian Quarterly National Accounts dataset (AusGDP). The smaller this value, the more accurate the forecast. Approaches that performed worse than the benchmark model (Bootstrap base forecasts) are highlighted in red, the best for each column is marked in bold and in blue the lowest value. The notation used to refer to the reconciliation and base forecast samples is explained in more details in Section 8.1 of the paper.

Base forecasts' sample approach							
Reconciliation	Gaussian frameworks: shrinkage covariance matrix						
approach	Bootstrap	Multi-ster	o residuals		ping and		
арргоасы					residuals		
		G	H	G	H		
		$\forall k \in \{4, 2$					
base	1.000	0.967	1.002	0.957	0.980		
$\operatorname{ct}(shr_{cs},bu_{te})$	0.897	0.968	0.969	0.963	0.962		
$\operatorname{ct}(wls_{cs},bu_{te})$	0.886	0.939	0.944	0.882	0.888		
$\operatorname{oct}_o(wlsv)$	0.891	0.950	0.945	0.889	0.892		
$\operatorname{oct}_o(bdshr)$	0.940	0.935	0.933	0.922	0.909		
$\operatorname{oct}_o(shr)$	0.900	0.935	0.928	0.895	0.884		
$\operatorname{oct}_o(hshr)$	0.956	0.997	1.015	0.945	0.965		
$\operatorname{oct}_{oh}(shr)$	1.059	0.981	0.983	1.021	0.962		
$\operatorname{oct}_{oh}(hshr)$	0.986	0.996	1.014	0.973	1.005		
		k = 1					
base	1.000	0.973	0.973	0.961	0.962		
$\operatorname{ct}(shr_{cs},bu_{te})$	0.964	1.012	1.012	1.009	1.004		
$\operatorname{ct}(wls_{cs},bu_{te})$	0.954	0.994	0.998	0.947	0.952		
$\operatorname{oct}_o(wlsv)$	0.958	1.002	0.997	0.953	0.956		
$\operatorname{oct}_o(\overrightarrow{bdshr})$	1.004	0.965	0.964	0.969	0.959		
$\cot_o(shr)$	0.973	0.984	0.982	0.960	0.950		
$\operatorname{oct}_o(hshr)$	1.021	1.049	1.062	1.007	1.024		
$\operatorname{oct}_{oh}(shr)$	1.130	1.034	1.041	1.083	1.029		
$\operatorname{oct}_{oh}(hshr)$	1.053	1.050	1.064	1.034	1.063		
,		k = 2					
base	1.000	0.970	0.999	0.955	0.980		
$\operatorname{ct}(shr_{cs},bu_{te})$	0.915	0.987	0.988	0.983	0.982		
$\operatorname{ct}(wls_{cs},bu_{te})$	0.904	0.958	0.962	0.900	0.906		
$\operatorname{oct}_o(wlsv)$	0.908	0.972	0.964	0.908	0.911		
$oct_o(bdshr)$	0.960	0.959	0.957	0.945	0.932		
$\operatorname{oct}_o(shr)$	0.921	0.958	0.950	0.917	0.905		
$\operatorname{oct}_o(hshr)$	0.977	1.021	1.038	0.966	0.987		
$\operatorname{oct}_{oh}(shr)$	1.082	1.002	1.003	1.045	0.982		
$oct_{oh}(hshr)$	1.007	1.017	1.036	0.994	1.028		
octon (rester)	1.001	k=4	1.000	0.001	1.020		
base	1 000	$\kappa = 4$ 0.958	1 022	0.953	1 000		
	1.000		1.033		1.000		
$\operatorname{ct}(shr_{cs},bu_{te})$	0.818	0.909	0.910	0.902	0.902		
$\operatorname{ct}(wls_{cs}, bu_{te})$	0.807	0.871	0.876	0.805	0.812		
$oct_o(wlsv)$	0.812	0.882	0.876	0.812	0.816 0.841		
$\operatorname{oct}_o(bdshr)$	0.860	0.884	0.879	0.857			
$\operatorname{oct}_o(shr)$	0.814	0.867	0.857	0.815	0.803		
$oct_o(hshr)$	0.876	0.926	0.949	0.868	0.889		
$\operatorname{oct}_{oh}(shr)$	0.971	0.910	0.911	0.941	0.882		
$\operatorname{oct}_{oh}(hshr)$	0.904	0.924	0.947	0.896	0.929		

Table 4: ES skill score presented in equation (18) and (19) of the paper for the Australian Quarterly National Accounts dataset (AusGDP). The smaller this value, the more accurate the forecast. Approaches that performed worse than the benchmark model (Bootstrap base forecasts) are highlighted in red, the best for each column is marked in bold and in blue the lowest value. The notation used to refer to the reconciliation and base forecast samples is explained in more details in Section 8.1 of the paper.

	Base forecasts' sample approach						
Reconciliation		Gaussian frameworks: sample covariance matrix Overlapping and					
approach	Bootstrap	Multi-step	residuals		residuals		
		G	$_{ m H}$	G	Н		
		$\forall k \in \{4, 2\}$	1 l				
base	1.000	0.979	0.995	0.968	0.976		
$\operatorname{ct}(shr_{cs}, bu_{te})$	0.937	0.956	0.956	0.976	0.976		
$\operatorname{ct}(wls_{cs},bu_{te})$	0.930	0.917	0.917	0.898	0.898		
oct(wlsv)	0.926	0.919	0.920	0.900	0.900		
$\cot(bdshr)$	0.940	0.965	0.945	0.992	0.957		
oct(shr)	0.944	1.020	0.940	1.094	0.988		
oct(hshr)	0.988	0.972	1.002	0.974	1.001		
$oct_o(wlsv)$	0.926	0.911	0.912	0.896	0.895		
$\operatorname{oct}_o(bdshr)$	0.978	0.964	0.946	0.952	0.930		
$\operatorname{oct}_o(shr)$	0.950	0.946	0.922	0.925	0.903		
$oct_o(hshr)$	0.989	0.966	0.984	0.954	0.965		
$\operatorname{oct}_{oh}(shr)$	1.102	1.059	1.001	1.094	0.988		
$\operatorname{oct}_{oh}(hshr)$	1.006	0.983	1.009	0.974	1.001		
(' ' ')		k = 1		-			
base	1.000	0.988	0.988	0.971	0.971		
$\operatorname{ct}(shr_{cs},bu_{te})$	0.992	1.008	1.008	1.029	1.029		
$\operatorname{ct}(wls_{cs},bu_{te})$	0.986	0.974	0.975	0.956	0.956		
oct(wlsv)	0.984	0.981	0.979	0.959	0.959		
oct(bdshr)	0.997	1.019	1.003	1.044	1.018		
oct(shr)	1.015	1.095	1.010	1.160	1.059		
$\cot(hshr)$	1.048	1.037	1.060	1.034	1.061		
$\operatorname{oct}_o(wlsv)$	0.984	0.971	0.970	0.954	0.954		
$\operatorname{oct}_o(bdshr)$	1.034	1.016	1.003	1.005	0.989		
$\operatorname{oct}_o(shr)$	1.014	1.003	0.985	0.987	0.968		
$\operatorname{oct}_o(hshr)$	1.047	1.028	1.038	1.012	1.023		
$\operatorname{oct}_{oh}(shr)$	1.172	1.109	1.066	1.160	1.059		
$\operatorname{oct}_{oh}(hshr)$	1.068	1.046	1.059	1.034	1.061		
,		k = 2					
base	1.000	0.984	0.993	0.968	0.976		
$\operatorname{ct}(shr_{cs},bu_{te})$	0.949	0.966	0.966	0.987	0.987		
$\operatorname{ct}(wls_{cs},bu_{te})$	0.942	0.928	0.928	0.909	0.909		
$\cot(wlsv)$	0.938	0.929	0.931	0.911	0.911		
$\cot(bdshr)$	0.953	0.976	0.956	1.003	0.969		
$\cot(shr)$	0.955	1.031	0.951	1.113	1.002		
$\cot(hshr)$	1.001	0.985	1.014	0.987	1.016		
$oct_o(wlsv)$	0.938	$\boldsymbol{0.921}$	0.923	0.907	0.906		
$\operatorname{oct}_o(bdshr)$	0.991	0.974	0.957	0.964	0.942		
$\operatorname{oct}_o(shr)$	0.965	0.958	0.934	0.938	0.916		
$\operatorname{oct}_o(hshr)$	1.002	0.979	0.996	0.967	0.978		
$\operatorname{oct}_{oh}(shr)$	1.120	1.069	1.013	1.113	1.002		
$\operatorname{oct}_{oh}(hshr)$	1.021	0.996	1.021	0.987	1.016		
		k = 4					
base	1.000	0.966	1.004	0.964	0.981		
$\operatorname{ct}(shr_{cs},bu_{te})$	0.874	0.896	0.896	0.914	0.914		
$\operatorname{ct}(wls_{cs},bu_{te})$	0.866	0.853	0.853	0.834	0.834		
oct(wlsv)	0.860	0.853	0.855	0.835	0.834		
oct(bdshr)	0.874	0.904	0.880	0.931	0.889		
$\cot(shr)$	0.866	0.940	0.864	1.015	0.909		
$\cot(hshr)$	0.919	0.900	0.935	0.904	0.931		
$\operatorname{oct}_o(wlsv)$	0.860	0.847	0.848	$\boldsymbol{0.832}$	0.830		
$\operatorname{oct}_o(bdshr)$	0.914	0.905	0.883	0.892	0.865		
$\operatorname{oct}_o(shr)$	0.877	0.882	0.852	0.854	0.831		
$oct_o(hshr)$	0.922	0.898	0.923	0.888	0.898		
$\operatorname{oct}_{oh}(shr)$	1.020	1.002	0.928	1.015	0.909		
$\operatorname{oct}_{oh}(hshr)$	0.934	0.912	0.951	0.904	0.931		

Table 5: CRPS

	Base forecasts' sample approach						
Reconciliation	D 44		ameworks: shrinkage covariance m Overlapping an				
approach	Bootstrap	Multi-step	residuals		residuals		
		\mathbf{G}	H	G	Η		
		$\forall k \in \{4, 2\}$, 1}				
base	1.000	0.979	1.011	0.968	0.987		
$\operatorname{ct}(shr_{cs}, bu_{te})$	0.937	0.960	0.961	0.962	0.960		
$\operatorname{ct}(wls_{cs}, bu_{te})$	0.930	0.951	0.953	0.911	0.915		
oct(wlsv)	0.926	0.972	0.957	0.918	0.917		
oct(bdshr)	0.940	0.986	0.966	0.981	0.956		
oct(shr)	0.944	0.999	0.962	1.051	0.995		
oct(hshr)	0.988	1.000	1.021	0.979	1.002		
$oct_o(wlsv)$	0.926	0.961	0.948	0.914	0.912		
$oct_o(bdshr)$	0.978	0.956	0.949	0.949	0.934		
$oct_o(shr)$	0.950	0.957	0.946	0.933	0.917		
$oct_o(shr)$	0.989	0.997	1.013	0.967	0.982		
` /	1.102	1.010	1.015 1.006	1.051	0.982 0.995		
$\operatorname{oct}_{oh}(shr)$				0.979			
$\operatorname{oct}_{oh}(hshr)$	1.006	0.989	1.004	0.979	1.002		
L.	1 000	k=1	0.000	0.071	0.051		
base	1.000	0.988	0.988	0.971	0.971		
$\operatorname{ct}(shr_{cs}, bu_{te})$	0.992	1.001	1.001	1.004	1.000		
$\operatorname{ct}(wls_{cs}, bu_{te})$	0.986	0.997	0.998	0.964	0.967		
oct(wlsv)	0.984	1.010	1.003	0.971	0.970		
oct(bdshr)	0.997	1.015	1.006	1.016	1.000		
oct(shr)	1.015	1.047	1.021	1.105	1.058		
oct(hshr)	1.048	1.045	1.066	1.034	1.053		
$\operatorname{oct}_o(wlsv)$	0.984	1.000	0.993	0.966	0.965		
$oct_o(bdshr)$	1.034	0.984	0.983	0.988	0.977		
$\operatorname{oct}_o(shr)$	1.014	0.998	0.995	0.986	0.974		
$\operatorname{oct}_o(hshr)$	1.047	1.039	1.054	1.019	1.032		
$\operatorname{oct}_{oh}(shr)$	1.172	1.059	1.063	1.105	1.058		
$\operatorname{oct}_{oh}(hshr)$	1.068	1.037	1.050	1.034	1.053		
		k = 2					
base	1.000	0.984	1.009	0.968	0.987		
$\operatorname{ct}(shr_{cs}, bu_{te})$	0.949	0.972	0.972	0.974	0.971		
$\operatorname{ct}(wls_{cs}, bu_{te})$	0.942	0.962	0.964	$\boldsymbol{0.923}$	0.927		
oct(wlsv)	0.938	0.988	0.968	0.931	0.929		
oct(bdshr)	0.953	1.004	0.979	0.996	0.970		
$\operatorname{oct}(shr)$	0.955	1.016	0.973	1.070	1.010		
$\cot(hshr)$	1.001	1.015	1.034	0.993	1.017		
$oct_o(wlsv)$	0.938	0.976	0.959	0.927	0.925		
$oct_o(bdshr)$	0.991	0.970	0.963	0.963	0.948		
$\operatorname{oct}_o(shr)$	0.965	0.973	0.959	0.948	0.931		
$oct_o(hshr)$	1.002	1.013	1.026	0.980	0.996		
$\operatorname{oct}_{oh}(shr)$	1.120	1.026	1.019	1.070	1.010		
$\operatorname{oct}_{oh}(hshr)$	1.021	1.005	1.017	0.993	1.017		
occon (rester)	11021	k=4	1,01,	0.000	1,01,		
base	1.000	$\kappa = 4$ 0.966	1.037	0.964	1.002		
$\operatorname{ct}(shr_{cs}, bu_{te})$	0.874	0.900	0.911		0.910		
				0.910			
$\operatorname{ct}(wls_{cs}, bu_{te})$	0.866	0.897	0.900	0.851	0.855		
oct(wlsv)	0.860	0.921	0.903	0.856	0.856		
$\cot(bdshr)$	0.874	0.942	0.914	0.932	0.900		
$\cot(shr)$	0.866	0.937	0.895	0.981	0.922		
oct(hshr)	0.919	0.942	0.965	0.913	0.937		
$\operatorname{oct}_o(wlsv)$	0.860	0.910	0.894	0.853	0.852		
$oct_o(bdshr)$	0.914	0.917	0.905	0.899	0.880		
$\operatorname{oct}_o(shr)$	0.877	0.903	0.886	0.868	0.850		
$oct_o(hshr)$	0.922	0.943	0.962	0.905	0.921		
$\operatorname{oct}_{oh}(shr)$	1.020	0.947	0.939	0.981	0.922		
$\operatorname{oct}_{oh}(hshr)$	0.934	0.929	0.946	0.913	0.937		

Table 6: CRPS

	Base forecasts' sample approach						
Reconciliation	Gaussian frameworks: sample covariance matrix						
approach	Bootstrap	Multi-ster	residuals	Overlapping and multi-step residuals			
		G	Н	muiti-step G	residuais H		
				u			
1	1 000	$\forall k \in \{4, 2\}$		0.000	0.070		
base	1.000	0.970	0.988	0.960	0.970		
$\operatorname{ct}(shr_{cs}, bu_{te})$	0.897	0.944	0.944	0.973	0.973		
$\operatorname{ct}(wls_{cs},bu_{te})$	0.886	0.880	0.880	0.860	0.860		
oct(wlsv)	0.890	0.890	0.894	0.872	0.872		
oct(bdshr)	0.905	0.956	0.934	0.992	0.954		
oct(shr)	0.895	0.979	0.895	1.053	0.944		
oct(hshr)	0.951	0.940	0.973	0.959	0.992		
$\operatorname{oct}_o(wlsv)$	0.891	0.879	0.881	0.864	0.864		
$\operatorname{oct}_o(bdshr)$	0.940	0.928	0.910	0.918	0.895		
$\operatorname{oct}_o(shr)$	0.900	0.899	$\boldsymbol{0.876}$	0.878	0.858		
$\operatorname{oct}_o(hshr)$	0.956	0.936	0.955	0.922	0.936		
$\operatorname{oct}_{oh}(shr)$	1.059	1.015	0.956	1.053	0.945		
$\operatorname{oct}_{oh}(hshr)$	0.986	0.968	0.999	0.959	0.992		
		k = 1					
base	1.000	0.977	0.977	0.965	0.965		
$\operatorname{ct}(shr_{cs}, bu_{te})$	0.964	1.001	1.001	1.033	1.033		
$\operatorname{ct}(wls_{cs}, bu_{te})$	0.954	0.944	0.945	0.928	0.928		
oct(wlsv)	0.958	0.957	0.957	0.938	0.939		
$\cot(\dot{b}dshr)$	0.972	1.014	0.994	1.048	1.018		
$\operatorname{oct}(shr)$	0.973	1.060	0.969	1.121	1.015		
$\operatorname{oct}(hshr)$	1.017	1.010	1.034	1.023	1.055		
$\operatorname{oct}_o(wlsv)$	0.958	0.945	0.945	0.931	0.931		
$oct_o(bdshr)$	1.004	0.986	0.971	0.980	0.961		
$\operatorname{oct}_o(shr)$	0.973	0.963	0.944	0.949	0.930		
$oct_o(hshr)$	1.021	1.004	1.012	0.987	1.000		
$\operatorname{oct}_{oh}(shr)$	1.130	1.063	1.019	1.121	1.016		
$\operatorname{oct}_{oh}(hshr)$	1.053	1.034	1.049	1.024	1.055		
occon (non)	1.000	k=2	1.010	1.021	1.000		
boso	1 000		0.005	0.050	0.060		
base	1.000	0.972	0.985	0.959	0.969		
$\operatorname{ct}(shr_{cs}, bu_{te})$	0.915 0.904	0.961	0.960	0.991	0.991		
$\operatorname{ct}(wls_{cs}, bu_{te})$		0.896	0.896	0.877	0.877		
oct(wlsv)	0.909	0.907	0.912	0.889	0.889		
oct(bdshr)	0.925	0.976	0.953	1.013	0.974		
oct(shr)	0.913	1.000	0.914	1.076	0.963		
oct(hshr)	0.973	0.960	0.993	0.978	1.014		
$\operatorname{oct}_o(wlsv)$	0.908	0.895	0.898	0.881	0.882		
$oct_o(bdshr)$	0.960	0.947	0.929	0.938	0.915		
$oct_o(shr)$	0.921	0.919	0.896	0.898	0.878		
$oct_o(hshr)$	0.977	0.956	0.976	0.942	0.957		
$\operatorname{oct}_{oh}(shr)$	1.082	1.029	0.973	1.076	0.963		
$\operatorname{oct}_{oh}(hshr)$	1.007	0.988	1.017	0.979	1.014		
		k = 4					
base	1.000	0.959	1.000	0.957	0.976		
$\operatorname{ct}(shr_{cs},bu_{te})$	0.818	0.874	0.874	0.899	0.900		
$\operatorname{ct}(wls_{cs}, bu_{te})$	0.807	0.805	0.805	0.782	0.783		
$\operatorname{oct}(wlsv)$	0.811	0.813	0.819	0.794	0.794		
$\cot(bdshr)$	0.825	0.883	0.860	0.920	0.876		
$\overrightarrow{\operatorname{oct}(shr)}'$	0.807	0.885	0.808	0.967	0.861		
$\cot(hshr)$	0.871	0.856	0.897	0.881	0.913		
$\operatorname{oct}_o(wlsv)$	0.812	0.802	0.806	0.786	0.786		
$oct_o(bdshr)$	0.860	0.856	0.836	0.841	0.816		
$oct_o(shr)$	0.814	0.821	0.796	0.794	0.775		
$oct_o(hshr)$	0.876	0.854	0.882	0.844	0.856		
$\operatorname{oct}_{oh}(shr)$	0.971	0.954	0.882	0.967	0.861		
$\operatorname{oct}_{oh}(hshr)$	0.904	0.888	0.934	0.881	0.913		

Table 7: ES

	Base forecasts' sample approach						
Reconciliation	_			shrinkage covari Overlap			
approach	Bootstrap Multi-s		o residuals	multi-step	_		
		G	Н	G	Н		
		$\forall k \in \{4, 2\}$	1}				
base	1.000	0.967	1.002	0.957	0.980		
$\operatorname{ct}(shr_{cs},bu_{te})$	0.897	0.968	0.969	0.963	0.962		
$\operatorname{ct}(wls_{cs},bu_{te})$	0.886	0.939	0.944	0.882	0.888		
oct(wlsv)	0.890	0.966	0.959	0.897	0.901		
$\cot(bdshr)$	0.905	0.997	0.981	0.986	0.960		
$\cot(shr)$	0.895	0.979	0.945	1.021	0.962		
oct(hshr)	0.951	0.997	1.023	0.973	1.005		
$oct_o(wlsv)$	0.891	0.950	0.945	0.889	0.892		
$oct_o(bdshr)$	0.940	0.935	0.933	0.922	0.909		
$oct_o(shr)$	0.900	0.935	0.928	0.895	0.884		
$oct_o(hshr)$	0.956	0.997	1.015	0.945	0.965		
$\operatorname{oct}_{oh}(shr)$	1.059	0.981	0.983	1.021	0.962		
$\operatorname{oct}_{oh}(hshr)$	0.986	0.996	1.014	0.973	1.005		
ocom (non)	0.000	k = 1	1.011	0.010	1.000		
base	1.000	6.973	0.973	0.961	0.962		
$\operatorname{ct}(shr_{cs}, bu_{te})$	0.964	1.012	1.012	1.009	1.004		
$\operatorname{ct}(wls_{cs},bu_{te})$	0.954	0.994	0.998	0.947	0.952		
oct(wlsv)	0.958	1.017	1.012	0.960	0.965		
$\cot(bdshr)$	0.972	1.031	1.021	1.024	1.005		
oct(shr)	0.973	1.041	1.011	1.083	1.028		
$\cot(hshr)$	1.017	1.051	1.073	1.034	1.063		
$oct_o(wlsv)$	0.958	1.002	0.997	0.953	0.956		
$oct_o(bdshr)$	1.004	0.965	0.964	0.969	0.959		
$\cot_o(shr)$	0.973	0.984	0.982	0.960	0.950		
$oct_o(hshr)$	1.021	1.049	1.062	1.007	1.024		
$oct_{oh}(shr)$	1.130	1.034	1.041	1.083	1.029		
$\operatorname{oct}_{oh}(hshr)$	1.053	1.050	1.064	1.034	1.063		
()		k = 2					
base	1.000	0.970	0.999	0.955	0.980		
$\operatorname{ct}(shr_{cs},bu_{te})$	0.915	0.987	0.988	0.983	0.982		
$\operatorname{ct}(wls_{cs}, bu_{te})$	0.904	0.958	0.962	0.900	0.906		
$\operatorname{oct}(wlsv)$	0.909	0.988	0.979	0.916	0.920		
$\operatorname{oct}(\overset{.}{b}dshr)$	0.925	1.024	1.005	1.010	0.984		
$\cot(shr)$	0.913	1.006	0.967	1.045	0.982		
$\cot(hshr)$	0.973	1.020	1.046	0.994	1.028		
$\operatorname{oct}_o(wlsv)$	0.908	0.972	0.964	0.908	0.911		
$\operatorname{oct}_o(bdshr)$	0.960	0.959	0.957	0.945	0.932		
$\operatorname{oct}_o(shr)$	0.921	0.958	0.950	0.917	0.905		
$\operatorname{oct}_o(hshr)$	0.977	1.021	1.038	0.966	0.987		
$\operatorname{oct}_{oh}(shr)$	1.082	1.002	1.003	1.045	0.982		
$\operatorname{oct}_{oh}(hshr)$	1.007	1.017	1.036	0.994	1.028		
		k = 4					
base	1.000	0.958	1.033	0.953	1.000		
$\operatorname{ct}(shr_{cs}, bu_{te})$	0.818	0.909	0.910	0.902	0.902		
$\operatorname{ct}(wls_{cs}, bu_{te})$	0.807	0.871	0.876	0.805	0.812		
$\operatorname{oct}(wlsv)$	0.811	0.896	0.891	0.820	0.825		
$\cot(bdshr)$	0.825	0.938	0.919	0.926	0.895		
$\operatorname{oct}(shr)$	0.807	0.898	0.864	0.940	0.881		
$\operatorname{oct}(\overset{\circ}{h}sh\overset{\circ}{r})$	0.871	0.924	0.954	0.897	0.929		
$oct_o(wlsv)$	0.812	0.882	0.876	0.812	0.816		
$\operatorname{oct}_o(bdshr)$	0.860	0.884	0.879	0.857	0.841		
$\operatorname{oct}_o(shr)$	0.814	0.867	0.857	0.815	0.803		
$\operatorname{oct}_o(hshr)$	0.876	0.926	0.949	0.868	0.889		
$\operatorname{oct}_{oh}(shr)$	0.971	0.910	0.911	0.941	0.882		
$\operatorname{oct}_{oh}(hshr)$	0.904	0.924	0.947	0.896	0.929		

Table 8: ES