Informer Autoformer Pyraformer FEDformer Quatformer Crossformer MSHyper IMP Methods (AAAI 2021) (ICML 2022) (NeurIPS 2021) (ICLR 2021) (KDD 2022) (ICLR 2023) (Ours) Metric MSE MAE MSE 0.300 0.384 0.266 0.336 0.503* 0.518* 0.217 0.296 0.211 0.279 0 444* 0.473* 0.164 0.217 22.27%

0.541

0.536

0.557

0.297

0.361

0.386

0.515

0.412

0.433

0.464

0.251*

0.310

0.381

0.197

0.205*

0.220

0.523

0.375

0.408

0.472*

0.295*

0.344

0.374

0.308

0.315*

0.329

0.525

0.398

0.424

0.468*

0.473

0.495

0.526

0.185*

0.231

0.323

0.519

0.320

0.404

0.569

0.197

0.262

0.309

0.183

0.193

0.205

0.503

0.315

0.394

0.451

0.494

0.515

0.542

0.278*

0.309

0.369

0.524

0.373

0.427

0.528

0.246

0.298

0.325

0.271

0.298

0.310

0.507

0.365

0.419

0.462

21.51%

15.48%

18.90%

0%

5.85%

6.82%

3.08%

1.56%

1.01%

0.88%

improvement of MSHyper over the best baseline. The best results are **bolded** and the second best results are underlined.

0.564

0.533

0.562

0.183

0.263

0.305

0.521

0.366

0.398

0.455

0.521

0.543

0.553

0.371*

0.455

0.456

0.792

0.504

0.657

0.678

96

168

336

720

168

336

720

288

672

0.608

0.702

0.831

0.274

0.368

0.381

1.215

0.678

1.056

1.192

0.567

0.620

0.731

0.368

0.424

0.431

0.896

0.614

0.786

0.926

0.574

0.600

0.587

0.255

0.299

0.375

0.539

0.502

0.604

0.607

0.548

0.571

0.570

0.339

0.387

0.428

0.537

0.476

0.522

0.530

0.519

0.539

0.547

0.272*

0.452

0.463

0.993

0.520

0.729

0.980

Table 1: Multivariate long-range time series forecasting results on five real-world datasets. The input length is set as I = 168, and the prediction length O is set as 96, 168, 336, and 720 (For ETTm1, the prediction length is set as 96, 288, 672, and 720). IMP shows the

MAE

22.22%

16.61%

13.37%

13.10%

2.52%

3.56%

5.78%

6.00% 3.40% 3.17% 4.77%

1.55% 2.14%

1.17%

0.43%

3.88%

24.01%

6.23%

4.33%

4.79%

Ш	720	0.406	0.443	0.377	0.434	0.480	0.461	0.372	0.434	0.245	0.350	0.404	0.423	0.230	0.329	6.12%
Ih1	96	0.865	0.713	0.449	0.459	0.701*	0.635*	0.376	0.419	0.422*	0.447*	0.396*	0.412*	0.375	0.398	0.27%
	168	0.931	0.752	0.493	0.479	0.781	0.675	0.412	0.449	0.453	0.489	0.410	0.441	0.405	0.427	1.22%
E	336	1.128	0.873	0.509	0.492	0.912	0.747	0.456	0.474	0.491	0.495	0.440	0.461	0.428	0.439	2.73%

720 1.166 0.823 0.671 0.561 0.912* 0.727*0.543 0.4900.499 0.502 0.751* 0.677*0.493 0.471 1.20% 0.719 0.391 0.613 0.388 0.628* 0.354* 0.587 0.366 0.618 0.384 0.450* 0.477* 0.408 0.269 9.33% 0.660 0.391 0.649 0.407 0.635 0.347 0.607 0.385 0.621* 0.399* 0.513 0.418 0.271 18.52% 168 0.289

³³⁶ 0.747 0.405 0.624 0.388 0.347 0.624 0.389 0.622 0.384 0.530 0.300 0.431 0.287 18.68% 0.641

⁷²⁰ 0.792 0.430 0.674 0.417 0.670 0.364 0.623 0.378 0.629 0.383 0.573 0.313 0.463 0.298 * indicates that some methods do not have uniform prediction lengths with other methods. To ensure a fair comparison, we utilize their official code and adjust prediction lengths.

^{19.20%}