Downscaling system for modelling of atmospheric composition on regional, urban and street scales

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10   **Abstract.** In this study, the downscaling modelling chain for prediction of weather and atmospheric composition is described and evaluated against observations. The chain consists of interfaced models for forecasting at different spatio-temporal scales and run in a semi-operational mode. The forecasts were performed for European (EU) regional and Danish (DK) sub-regional/urban-scales by the offline coupled numerical weather prediction HIRLAM and atmospheric chemical transport CAMx models, and for Copenhagen city/street scale - by the online coupled computational fluid dynamics M2UE model.

15   The results showed elevated NO_x and lowered O_3 concentrations over major urban, industrial and transport land/water routes in both the EU and DK domain forecasts. The O_3 diurnal cycle predictions in both these domains were equally good, although O_3 values were closer to observations for Denmark. At the same time, the DK forecast of NO_x levels was more biased (with better prediction score of the diurnal cycle) than EU forecast, indicating a necessity to adjust emission rates. Further downscaling to the street level (Copenhagen) indicated that the NO_x pollution was 2-fold higher on weekend and

20   more than 5 times higher during working day with high pollution episode. Despite of high uncertainty in road traffic emissions, the street-scale model captured well the NO_x diurnal cycle and onset of elevated pollution episode.

The demonstrated downscaling system could be used in future online integrated meteorology and air quality research and operational forecasting, as well as applied for impact assessments on environment, population and decision making for emergency preparedness and safety measures planning.

25   1 Introduction

A progress in numerical weather and atmospheric composition modelling and continuously increasing supercomputing power make it possible to perform downscaling and nesting from the global to the local scales reaching necessary horizontal and vertical resolutions for a very detailed local meteorology and pollution forecasts. The global and regional scale Atmospheric Chemistry Transport (ACT) modelling systems actively developed and applied during the last decade. These

30   were developed and applied within the frameworks of multiple EU FP6, FP7 and H2020 Monitoring of Atmospheric

Composition and Climate (MACC) projects (Hollingsworth et al., 2008; Simmons, 2010; Peuch et al., 2014; Peuch et al., 2016). Such systems simulate mostly the regional background of air pollution, for instance, in the Copernicus Atmosphere Monitoring Service (CAMS; Grasso, 2017). These large-scale models with increased resolution have limited performance improvement for rural areas (Schaap et al., 2015), but have better modelling scores at reproducing spatio-temporal pollution

35 gradients in and near large urban areas. As a matter of fact, urban and street air pollution is usually several times higher than the pollution at regional scale over suburbs and rural areas and is mostly associated with both local emission sources (Falasca and Curci, 2018) and dominating urban weather conditions (González et al., 2018). Therefore, improvements in performance of high-resolution models for urban areas are closely linked to availability and quality of emission inventories at high spatio-temporal resolution as well as accurate simulation of urban meteorology (Mahura et al., 2008a; Mahura et al.,

40 2008b; Pepe et al., 2016).

Generally, within the deterministic modelling approach, there are two ways applicable for downscaling modelling. It can be performed with a single model capable of local grid refinement (Gettelman et al., 2018) or nesting of numerical grids (Petersen et al., 2005; Lauwaet et al., 2013). It can be also realised as a chain of different resolution models interfacing with each other (Temel et al., 2018; Veratti et al., 2020). In the latter case, the need of different models is justified by the fact that

45 mesoscale models cannot capture local scale processes accurately since the fine-scale flow patterns should be explicitly resolved rather than parameterized (Schlünzen et al., 2011; Ching, 2013). As for the air-quality prediction systems, an offline (Kukkonen et al., 2012) and online (Baklanov et al., 2014) approaches of coupling meteorological and chemical transport models have been commonly used. Each of these has its own advantages and limitations.

The goal of this paper is to demonstrate and evaluate applicability of the downscaling system coupled with computational

50 fluid dynamics model on an example of operational modelling of an acute air-pollution episode. This system consists of several models with nested numerical grids where meteorological and atmospheric composition prediction on regional- and sub-regional/urban-scales is performed. Three interfaced and coupled models – (i) numerical weather prediction (HIRLAM; Undén et al., 2002); (ii) atmospheric chemical transport (CAMx; Ramboll Environ, 2016; Amstrup et al., 2010a; Amstrup et al., 2010b); (iii) computational fluid dynamics (M2UE; Nuterman, et al., 2010; Sabatino, et al., 2011) – were used for

55 airflow and pollution prediction at city/street-scale (on example of Copenhagen, Denmark). In the Methodology section, we firstly describe the applied models and their configurations; and secondly - their interplay within semi-operational setup of the downscaling system. The Results and Discussion section presents the models' evaluation against two urban observation sites (at roof and street levels) as well as recommendations about possible improvements in downscaling system to achieve better prediction quality of forecasting at finest scales.

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2 Methodology: downscaling model system

2.1 Description of models

HIRLAM

The Numerical Weather Prediction (NWP) model used in the current downscaling system is the DMI's version of HIgh-
65 Resolution Limited Area Model (HIRLAM; Undén et al., 2002; Petersen et al., 2005). It has basic components such as the
hydrostatic semi-Lagrangian dynamical core, digital filtering initialization (Lynch and Huang, 1992), physical
parameterization of radiation processes (Savijärvi, 1990), cloud-microphysics Soft Transition Condensation scheme (Sass,
2002), turbulence parametrization (Cuxart et al., 2000), and Interaction-Soil-Biosphere-Atmosphere surface scheme (ISBA;
Noilhan and Planton, 1989). The ISBA scheme also includes the building effect parametrization (BEP; Martilli et al., 2002)
70 module to account for effects associated with urban anthropogenic heat flux and roughness. The model is forced by
meteorological lateral boundary conditions and 3D-VAR assimilated ground-based and satellite observation data (Gustafsson
et al., 2001; Lindskog et al., 2001). The lateral boundaries are received every 6 h interval from the European Centre for
Medium-Range Weather Forecasts (ECMWF) and had horizontal grid resolution of 0.15°×0.15°.

(a)   (b)

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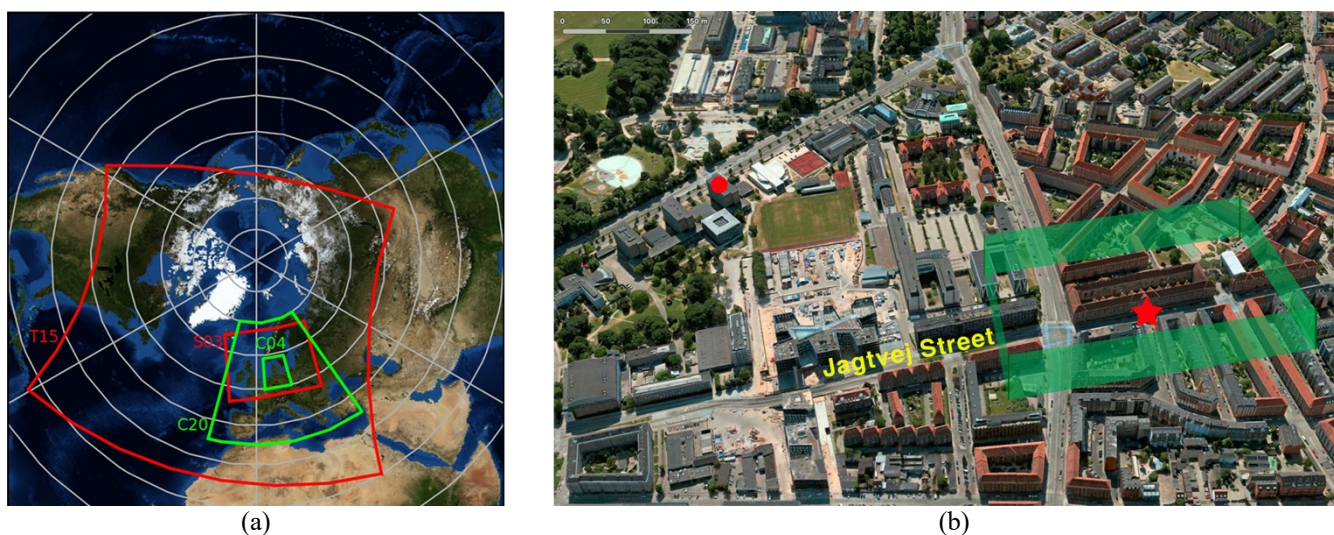
Figure 1: (a) operational and research modelling domains for European regional-scale (HIRLAM-T15+CAMx-C20) and sub-
regional/urban Denmark scale (HIRLAM-S03+CAMx-C04) forecasts; (b) Nørrebro district of Copenhagen urban area with 2 air-quality
monitoring stations, where red circle indicates a roof level air-quality observation at H.C. Ørsted Institute and red star indicates Jagtvej
80 Street level observation; the green trapezoid shows M2UE modelling domain (extracted from © Apple Maps 2020).

In this study, the chosen modelling domains were used for operational numerical weather prediction at DMI. These two
domains with crude (T15: 0.15°×0.15°) and fine (S03: 0.03°×0.03°) horizontal grids were applied for European regional and
sub-regional/urban Denmark scale modelling (Figure 1a), correspondingly. In vertical, 40 hybrid pressure levels (starting

85   from 32 m above ground) were used in T15 domain and 65 such levels (starting from 12 m above ground) - in S03 domain. The upper boundary reached 10 hPa at the top of the atmosphere in both computational domains.

There are approximately 8 x 8 horizontal grids cells (each cell is about 3 x 3 km size) covering the Copenhagen metropolitan area in S03 domain. According to (Mahura et al., 2008b), the HIRLAM model with activated BEP module must have at least 4 times more grid cells to predict a significant effect of the city area on meteorology. Thus, the BEP module was disabled

90   during operational forecasting with S03 domain, considering the employed numerical grid as well as city size and urban characteristics of Copenhagen.

CAMx

The Comprehensive Air Quality Model with Extensions (CAMx; Ramboll Environ, 2016) is the finite volume ACT model

95   for regional- and urban-scales employed for air-quality forecasting in our downscaling system. An updated version of Carbon Bond IV (CB-IV) Mechanism (Gery et al., 1989) with improved isoprene chemistry (Yarwood et al., 2005) and 2-mode aerosol microphysics scheme were used in the current setup. The Tropospheric Ultraviolet and Visible radiation model (Madronich and Focke, 1998) was applied to calculate photolysis rate coefficients. Further details about gas-phase chemistry and aerosol microphysics together with wet (Seinfeld and Pandis, 2016) and dry (Wesely, 1989; Slinn and Slinn, 1980)

100 deposition schemes are described in the model's users guide (Ramboll Environ, 2016).

For this study, two computational domains (Figure 1a) were selected within the ACT model for modelling on regional- (C20: $0.2°×0.2°$) and sub-regional/urban scales (C04: $0.04°×0.04°$) forced by meteorological output (with a coupling interval of 1 hour) from HIRLAM-T15 and -S03 modelling domains, respectively. The vertical resolution of CAMx numerical grid is defined by the one of meteorological driver and therefore, corresponds to 25 HIRLAM hybrid pressure levels covering the

105 lowest 3 km of the troposphere. The chemical initial and boundary conditions for regional-scale modelling are represented by climatological mean values, and those for the sub-regional/urban scale modelling are obtained from the regional scale CAMx model output.

The emission rates were calculated from emission inventory provided by TNO (Kuenen et al., 2010). The inventory has longitude-latitude resolution of $0.125°×0.0625°$ and covers the entire Europe, Western Russia and Northern Africa. It

110 includes gases ($NO_x, SO_2, CO, NMVOC, NH_3, CH_4$) and lumped primary aerosols with diameters less than 2.5 μm and 10 μm. The emission rates are associated with different anthropogenic sources attributed to various anthropogenic activities according to the Selected Nomenclature for sources of Air Pollution (SNAP).

M2UE

115 For the city/street scale modelling, the Micro-scale Model for Urban Environment (M2UE) was developed and applied. It is a Computational Fluid Dynamics (CFD) code for airflow and pollution prediction in an urban environment (Nuterman et al., 2010), which is able to simulate a complex aerodynamics in heterogeneous urban canopy with penetrable (vegetation) and impenetrable (buildings) obstacles and traffic induced turbulence. The model includes three-dimensional system of

Reynolds', $k - \varepsilon$ model of turbulence, and the 'advection-diffusion' equations to simulate atmospheric chemistry transport.
120   A numerical solution of governing equations is based on the fully implicit time advancing scheme and the finite volume method (Patankar, 1980; Ilin, 1995; van Leer, 1974). The model is coupled with simplified atmospheric gas-phase chemistry mechanism with 19 chemical reactions (Stockwell and Goliff, 2002). Such simple chemistry is dictated by the fact that the model was run in a semi-operational mode, which implies relatively short forecasting time on available computer facility. In the future, when more powerful supercomputers become available the mechanism could be extended or improved with more
125   comprehensive one.

The computational domain (a section of Jagtvej Street and surroundings) used in the current study is explicitly defined by buildings, roads, vegetation of the Copenhagen metropolitan (Figure 1b) area obtained from the high-resolution Danish Elevation Model dataset (Flatman et al., 2016). The horizontal and vertical extent of the computational domain is 500 x 500 x 100 m. The horizontal and vertical numerical grids with local refinement of grid-cells ranging from 1 m at the Jagtvej
130   Street to 5 m near the domain's boundaries was used. The Jagtvej Street emission inventory was derived from hourly traffic counts (Berkowicz et al., 2004) and emissions for different types of road-vehicles (Chao et al., 2018).

2.2 Description of downscaling model system

In the developed downscaling model system (Figure 2), both the European regional (hereafter referred to as the EU) and the sub-regional/urban Denmark scale (hereafter referred to as the DK) forecasts were performed by the off-line coupled
135   HIRLAM and CAMx models. After up-to-date meteorological data assimilation and boundary conditions from ECMWF became available, the HIRLAM-T15 produced 48 h meteorological forecast for the EU domain. This NWP model was always fully spun-up, because such forecast was performed in a continuous manner 4 times per day (at 00, 06, 12 and 18 UTC). Afterwards, the meteorological output was post-processed, interpolated and adapted to drive the CAMx-C20 model with a spin-up time of 48 hour and the forecast length of 24 hour. The spin-up integration was the model's cold-start run
140   prior to the current forecasted day. The entire cycle of offline coupled HIRLAM-T15+CAMx-C20 modelling chain took approximately 4.5 hour of CPU time.

As soon as the EU scale forecast is completed, the DK scale forecast of meteorology and atmospheric composition is initiated. In general, the entire procedure of model runs and interplay is very similar to the EU modelling chain. However, the differences were in boundary conditions, forcing and resolution of numerical grids. The HIRLAM-S03 meteorological
145   forecast was forced by outer model lateral boundaries, while the CAMx-C04 atmospheric composition forecast was forced by meteorology from HIRLAM-S03 plus chemical boundary and initial conditions from CAMx-C20. The forecast length of HIRLAM-S03 and CAMx-C04 runs was 36 h and 24 h, respectively. The forecast cycle used 4 h of CPU time since the DK forecast initiation.

After the urban-scale forecast completed, the street-scale (hereafter referred to as the street) forecast is launched for a section
150   of Jagtvej Street of Copenhagen and surroundings. For the Jagtvej's domain inlet boundaries, the Dirichlet conditions with constant profiles of airflow characteristics (from HIRLAM-S03) and atmospheric composition fields (from CAMx-C04)

were chosen to drive the M2UE model. The outlet boundary conditions are of Neumann type. The forecast for 24 h was performed after HIRLAM-S03+CAMx-C04 completed runs and it took ~1.5 h of CPU time. Since the M2UE model is very computationally expensive, the 24 h forecast was performed with 24 instant integration cycles forced by hourly HIRLAM-

155 CAMx models' output. In this case, the spin-up time was just several minutes; so, such as for individual M2UE forecast. It is a reasonable approach of doing such the forecast, because the boundary conditions and emission rates for each integration cycle were constant and only the rapid-photochemical reactions of O_3 and NO_x were of principal interest in the study. Therefore, the air-flow regime was assumed to be steady during an instant integration cycle. The ratio of horizontal resolution of HIRLAM-S03+CAMx-C04 and M2UE-Jagtvej domains exceeds a permissible limit of 5 (Sokhi et al., 2018).

160 However, the runtime of the entire modelling chain equals to 10 CPU hours, and adding an intermediate domain (or chain of domains) between these 3 model domains will obviously lead to increased runtime over 12 hours. Such large span of forecasting time is considered to be too large, taking into account the time constrains for operational tasks and cases when the models' rerun is required (not to mention pre-processing and post-processing the large amount of models' input and output). Thus, such downscaling is a trade-off between acceptable runtime and permissible resolution.

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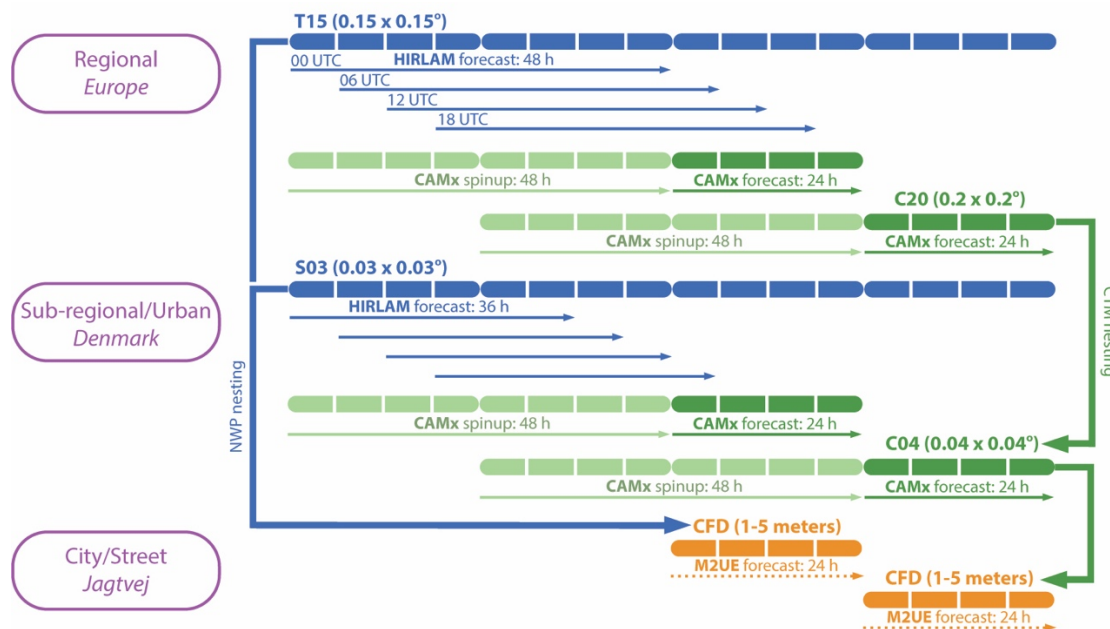
Figure 2: Downscaling modelling system: from the European regional-scale forecast (HIRLAM-T15+CAMx-C20) to the sub-regional/urban Denmark (HIRLAM-T03+CAMx-C04) and city/street scale for Copenhagen (CFD M2UE); the blue, green and orange horizontal bars indicate NWP HIRLAM, CTM CAMx and CFD M2UE forecasts, respectively; horizontal and vertical arrows indicate the
170 forecasts' cycles and downscaling (dataflow), correspondingly.

3 Results and Discussion

The example of the downscaling modelling chain realised in this study in a semi-operational mode with coupled HIRLAM+CAMx+M2UE models is described and evaluated with focus on Denmark and Copenhagen for specific meteorological situation.

175 During 4-5 September 2011 the meteorological situation was the following. The cyclonic system originated over Iceland moved southward towards the British Islands, and then eastward towards the Jutland Peninsula of Denmark with gradually changing atmospheric pressure from 990 to 1010 hPa. The cold front associated with cyclone passed over UK and Denmark on these days. On 4th September morning, the cold front approached the northern part of the Jutland Peninsula, and then propagated towards the Zealand Island, and brought up to 10 mm of accumulated (6 hour) precipitation. Over Denmark,

180 during night-morning hours on 5th September, the precipitation increased on average up to 15-20 mm (with several local maxima up to 40 mm). During these days, on a diurnal cycle the air temperature's range was 18-24 °C and 12-18 °C (on 4th and 5th September, respectively) with further gradual cooling. The vertical sounding diagrams (Schleswig, Germany, 54.53° N, 9.55° E – the closest station to Denmark) showed the presence of the temperature inversion layer extended up to 1.5 km (at noon on 4th Sep) and reduced to 500 m altitude (at night on 5th Sep), and then a layer of smaller depth remained at top of

185 boundary layer at noon.

A near surface spatial distribution of O_3 and NO_x concentrations (Figure 3ab) within the EU domain is shown for 5th Sep 2011, at 10 UTC. As seen, the elevated NO_x concentration of up to 50 ug m^{-3} was observed over urban, industrial and port areas of Denmark and neighbouring countries. In addition, the North Sea oil extraction and international shipping were other sources of elevated NO_x levels over the Danish territorial waters. The near surface O_3 concentration varied within the range

190 of 40-150 ug m^{-3}, with local minima over and downwind the areas of anthropogenic NO_x sources (Figure 3a) where ozone was depressed due to the NO_x titration.

As for the nested DK domain (Figure 3cd), it is seen from the near-surface wind and concentrations patterns that the mesoscale circulation as well as the local anthropogenic emission sources were resolved in greater details due to the finer S03-C04 horizontal resolution. Therefore, one can observe additional local concentration maxima of NO_x with higher levels

195 up to 250 ug m^{-3} over Denmark. These were mostly localized near the same type of anthropogenic sources as the mentioned above in the EU domain. As the result, there were more O_3 depression spots including those over the northern Jutland Peninsula's highways over the territories of Denmark and Germany. However, the background values of the near surface ozone did not change significantly at large distances from the anthropogenic NO_x sources.

In Figure 4, the time-series of O_3 and NO_x observations provided by the Danish air-quality monitoring programme (Ellerman

200 et al., 2012) and modelled concentrations by the downscaling system are presented. Those observations were performed by automatic stations (Figure 1b) at the roof level of H.C. Ørsted Institute and at the Jagtvej Street (only NO_x, particulate matter and benzene were measured on the street). As seen in Figure 4a, the T15-C20 and S03-C04 results showed an ability to reproduce well the O_3 diurnal cycle ($EU\_R_p = 0.81$ and $DK\_R_p = 0.8$, with p $\ll$ 5 %) for both domains at regional- and

sub-regional/urban scales. However, the forecasted O_3 at the EU scale was generally overestimated in comparison to the
205   modelling results at the DK scale ($EU\_RMSE = 31$ vs. $DK\_RMSE = 19$). Although, the NO_x levels were generally
overestimated in the DK scale forecast (Figure 4b) when compared to the EU scale forecast and observations ($EU\_RMSE = 23$ vs. $DK\_RMSE = 47$), the diurnal cycle at the DK scale is better captured according to obtained Pearson correlation
values ($EU\_R_p = 0.56$ vs. $DK\_R_p = 0.69$). And it is particularly notable when the NO_x peak was observed during several
morning hours (on 5th Sep 2011, 07 UTC). This caused by the complex unfavourable meteorological conditions over the
210   Copenhagen metropolitan area and high emission rates mainly from intense morning traffic. The timing and levels of NO_x
peak were well captured by the DK scale forecast in contrast to the EU one, which poorly predicted it with slightly elevated
NO_x values. Note, the O_3 depression at the same time, which was not captured by the EU air-quality forecast. Since the
primary sources of atmospheric nitrogen are anthropogenic emissions, its overestimated concentrations are rather attributed
to pre-processing and treatment of emission rates. It can be related to interpolation of original gridded emissions into the
215   meshes of ACT model, which is apparently insufficient, and therefore, some additional rescaling adjustments in terms of
emission rates and their time dynamics are required.

The diurnal cycle of NO_x concentrations observed and modelled for the Jagtvej Street is shown in Figure 4c. Following
analysis and calculated correlation value ($R_p = 0.66$), the street-scale M2UE model forecasted well the observed NO_x
diurnal cycle including the onset of elevated air pollution episode on 5th Sep (see forecast length 30-35 h). It corresponded to
220   the local time of 8-10 h of a typical working day (Monday) when the most intense road traffic is observed. However, the
model's quantitative estimate of concentration is substantially biased (with $RMSE = 103$) particularly during 5th Sep 2011.
In spite of the captured elevated NO_x levels, the model predicted two peaks at 31 and 34 h of forecast length and depression
at 32 h, while the time-series of observations showed only one peak at 32 h, which was approximately 200 ug m[-3] higher
than the modelled peaks.

225   There are several reasons why the M2UE model was able to make the qualitatively good prediction in general but had
difficulties at capturing the elevated NO_x concentrations. First of all, it is the coupling interval span of the offline coupled
models (HIRLAM+CAMx), which plays an important role in constraining the influence of mesoscale disturbances on
evolution of atmospheric composition (Korsholm et al., 2011). It might give an offset in timing and position of the predicted
concentrations. As seen in Figure 4ab, the effect of that at the onset of the high air pollution episode (where its slight offset
230   of approximately half an hour) was observed, and then inherited by the nested micro-scale model. The second reason is that
the M2UE forcing was provided on an hourly basis by the HIRLAM-S03+CAMx-C04 modelling chain. Such forcing is
rather crude in terms of time and horizontal resolution for the CFD model capable to predict very fine spatio-temporal
turbulent flow scales occurring within meters and seconds. The third reason is an uncertainty in local road traffic emissions
used by the M2UE model, although some traffic count data and information about emissions from different types of vehicles
235   were available (Chao et al., 2018). Although those above-mentioned shortcomings, the presented downscaling modelling
system was able to produce good quality atmospheric composition forecasts across different spatial and temporal scales.
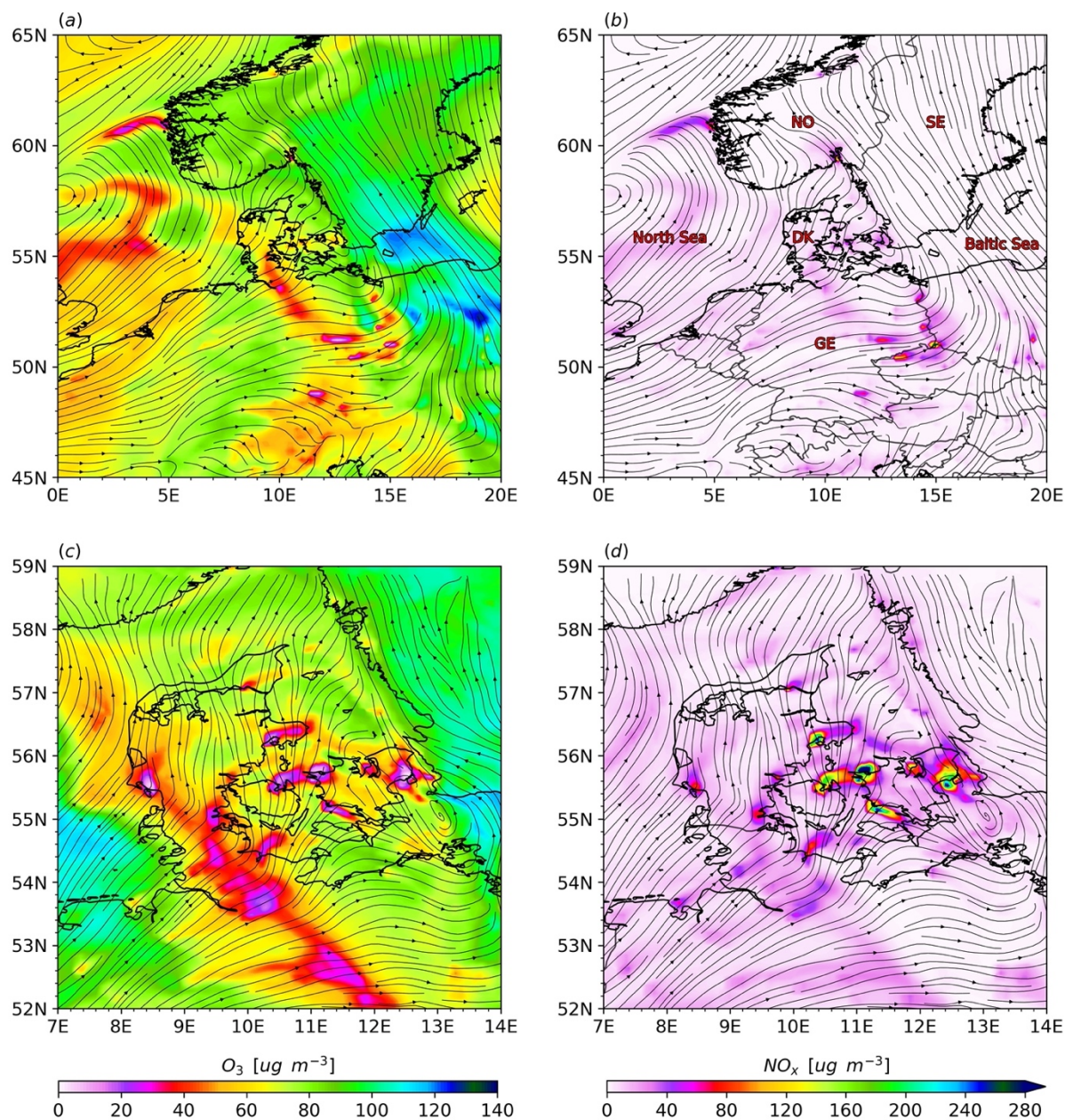
Figure 3: Simulation output on 5 Sep 2011, 10 UTC: HIRLAM-T15+CAMx-C20 results for concentrations in [μg m⁻³] of (a) O_3 and (b) NO_x within the European regional-scale domain and HIRLAM-S03+CAMx-C04 results for concentrations of (c) O_3 and (d) NO_x within the Denmark sub-regional/urban scale domain.
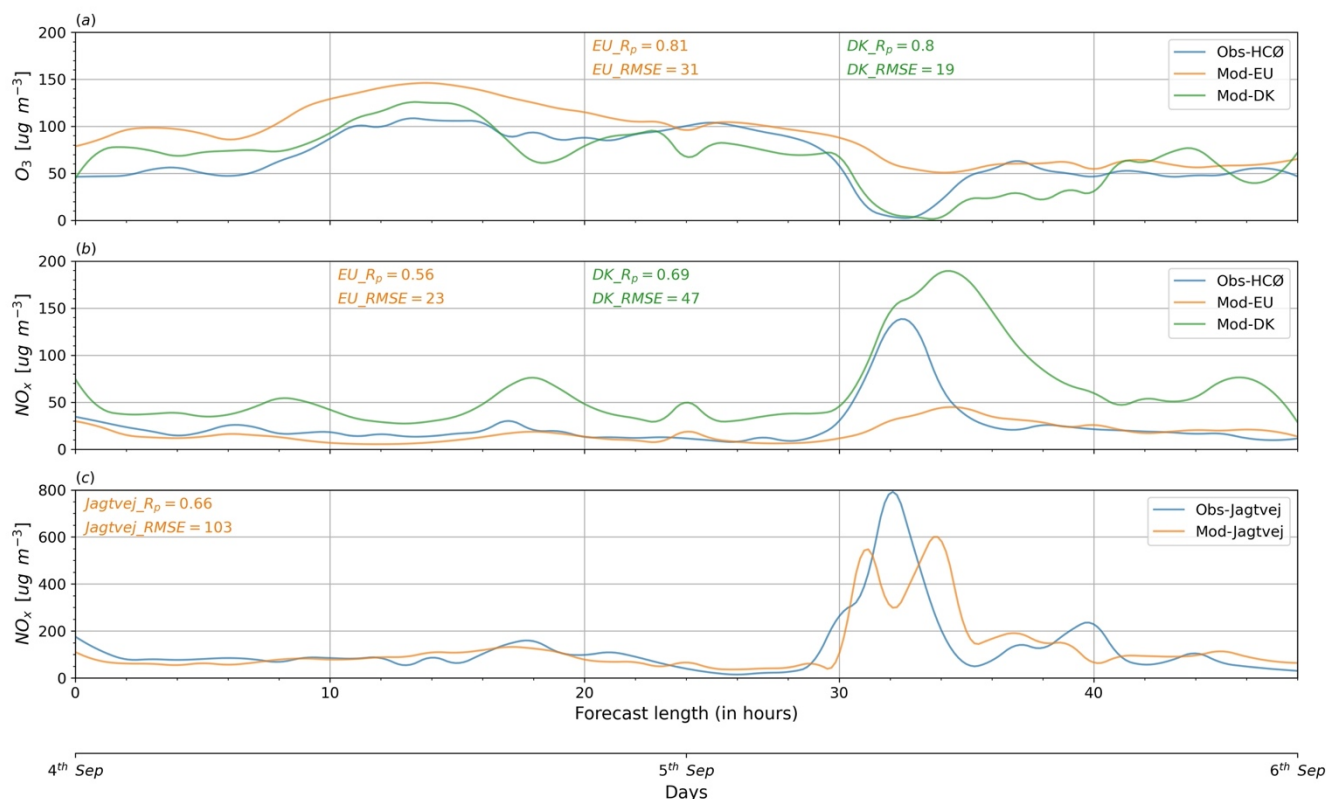
Figure 4: Time-series of observations at the building's roof level vs. HIRLAM+CAMx+M2UE forecasts for (a) O_3 and (b, c) NO_x for the European, Denmark and Copenhagen modelling domains during Sunday-Monday 4-5 Sep 2011; (a, b) HCØ roof level observations of O_3 and NO_x vs. modelling results for EU and DK domains; (c) Jagtvej Street level observations of NO_x vs. M2UE /Pearson's correlation R_p and root mean square error RMSE of modelled vs. observed concentrations for 3 domains/.

4 Conclusions

In this study, the downscaling modelling system for real time prediction of weather and atmospheric composition up to the street scale has been described and tested. It consists of several interfaced models. The forecasts were performed at the regional and sub-regional/urban-scales by the offline coupled operational numerical weather prediction HIRLAM and atmospheric chemical transport CAMx models and at the city/street scale by the online coupled computational fluid dynamics M2UE model. The downscaling system was tested for the Europe (EU), Denmark (DK) and Copenhagen's street domains in a semi-operational forecasting mode and evaluated against existing observations for a high pollution episode of 4-5 September 2011.

The results of modelling showed elevated NO_x and lowered O_3 concentrations over major urban, industrial and transport land/water routes in both EU and DK scale forecasts. The comparison of these forecasts showed higher levels of NO_x and slightly lower O_3 in the DK domain because of higher NO_x emission rates and titration. The O_3 diurnal cycle predictions in both the EU and DK domains are equally good, although O_3 values were closer to observations for DK. At the same time,

260   the DK scale forecast of NO_x levels was more biased (with better prediction score of the diurnal cycle) than EU scale forecast. Further downscaling to the street level indicated that the NO_x pollution (mainly from road traffic) was 2-fold higher on weekend and more than 5 times higher during working day with high pollution episode. Despite of high uncertainty in road traffic emissions, the M2UE model captured well the NO_x diurnal cycle and onset of elevated pollution episode. However, in order to come to the final conclusion about the performance of individual system's components and the entire

265   downscaling chain, one needs to perform an evaluation for extended time period and additional measurement sites around Denmark.

A potential improvement of such downscaling system can come from employing online coupled (instead of offline coupled) mesoscale models. Such approach could help to minimize problems associated with offline coupling interval and therefore, to give a better fit of modelling results to observations, and to better identify a timing and location of elevated pollution

270   episodes. As for the local-scale predictions, an intermediate additional nested domain between sub-regional/urban and micro-scale runs for the Copenhagen metropolitan area could provide improvement for local scale airflow and pollution forecasting scores. However, these will be conditioned on availability of a better-quality high-resolution emission inventory. The demonstrated downscaling system with the suggested above improvements could be used in future online integrated meteorology and air quality research and operational forecasting. Such system can be also applied for advanced planning

275   safety measures, post-accidental analysis, emergency preparedness and health/environment impact assessments.

Keeping in mind the main uncertainties (e.g., street-level emissions, increasing number of urban observations, etc.), there are several possibilities to improve demonstrated urban / street level forecasts using different types of observations (e.g., from remote sensing, crowed sourcing and citizen science) in urban areas. These observations and recently developing methods such as the bias correction techniques, machine learning, artificial intelligence and neural networks can also improve air-

280   quality forecasting (see overview e.g., in Bai et al., 2018).

Code availability

The HIRLAM model source code is available under the HIRLAM consortium agreement (http://hirlam.org). The CAMx model source code is an open-source software (can be downloaded from http://www.camx.com). The M2UE model source code is available from the authors upon request.

285   **Authors contribution**

AB, AM designed the research; BA, RN created and setup integrated downscaling of the models; AZ developed local scale gas-phase chemistry mechanism; RN performed models' evaluation; RN, AM and AB wrote the paper.

Competing interests

The authors declare that they have no conflict of interest.

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