High-resolution seasonal snowfall simulation over Northeast China

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Performance of the Weather Research and Forecasting (WRF) model in simulating seasonal snowfall over Northeast China was examined. The influences of horizontal resolution and physics parameterization schemes were also investigated. The results indicate that WRF can reasonably reproduce the main features of temperature and precipitation. The simulated spatial and temporal distribution of snowfall compared well with observations. Higher resolution simulations achieved better results, and WRF was found to be more sensitive to the choice of land surface and microphysics scheme than convective cumulus parameterization scheme.

Northeast China, seasonal snowfall, high-resolution simulation, WRF, physics parameterization scheme

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Recent global climate change and the subsequent impacts in terms of human adaptations are among the greatest challenges in modern times. While the warming trend is global, impacts of climate change are mainly experienced at the regional scale. Therefore, climate impact assessments, for both the present and future, primarily require regional- to local-scale climate data. However, most current operational weather forecasts systems cannot accurately simulate seasonal snowfall or snowpack, owing to their inability to resolve the necessary details of complex precipitation structures forced by mesoscale orography, land surface heterogeneities, and land-water contrasts. There are two ways to add value to global climate models (GCMs): statistical downscaling [1–5] and dynamical downscaling [6–9]. Regional climate models (RCMs) collectively represent one of the most effective approaches for adding fine-scale details to simulated climate change. For example, previous studies have indicated that RCMs could greatly improve simulations of monsoon precipitation compared to GCMs, mainly due to their higher resolution and more complex physical processes [10–12].

Intense snowfall events, which can bring heavy social

and economic losses, represent the main type of meteorological disaster experienced in northeastern China (NEC) in winter, and the frequency and intensity of such events have increased markedly since the 1950s [13,14]. Under the scenario of a warmer climate, intense snowfall events will still increase, mainly because of the acceleration of snowpack melting processes and evaporation, thus leading to enhanced water availability [15,16]. Therefore, research on snowfall events constitutes a major concern for meteorological science and policymakers, especially that involving high-resolution simulations.

Many previous studies have focused on intense snowfall, and their findings have provided us with a broad knowledgebase of the snowfall background circulation, formation and intensification processes [17–28]. However, most of this work has concentrated upon the background and synoptic analysis of special intense snowfall events; there is an absence in the literature of numerical simulations, and most studies have focused on the weather scale. Simulation of intense snowfall on the seasonal scale, although important and necessary, have been few, which is partly due to the coarse resolution and incompetence of existing numerical models.

Besides their horizontal resolution, many studies have

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revealed that current models are also quite sensitive to physics parameterization schemes, especially convective cumulus schemes [29–32]. Recent work has shown that land surface processes and microphysical schemes also play a comparatively important role [33]. Nevertheless, most physics parameterization studies have focused on rainfall, and less attention has been paid to snowfall.

This paper examines the performance of the Weather Research and Forecasting (WRF) model in simulating seasonal snowfall over NEC, and the associated influence of the model's configuration; namely, its horizontal resolution, as well as its land surface, microphysics and convective cumulus parameterization schemes. We attempt to address the following questions:

- (1) How well does WRF perform in simulating seasonal snowfall event over NEC? Can this state-of-the-art numerical model reproduce the spatial and temporal distribution of seasonal snowfall over this region?
- (2) What is the influence of horizontal resolution on snowfall simulation, and does a higher resolution mean better model performance?
- (3) What influences does the physical parameterization scheme have on simulation ability?

1 Model, data and experimental design

Version 3.3.1 of the WRF model was used for the simulations carried out in the present study. The development of WRF is overseen by a collaborative effort among U.S. research groups, including the National Center for Atmospheric Research (NCAR), the National Centers for Environmental Prediction (NCEP), the Forecast Systems Labor-

atory (FSL), the Air Force Weather Agency (AFWA), the Naval Research Laboratory, the University of Oklahoma, and the Federal Aviation Administration (FAA). It is widely used by weather forecasters and meteorological scientists for both weather and climate applications.

For the experiments in this study, we chose a large domain (d01) of 142×156 grids (W-E $\times$ N-S) with a horizontal resolution of 27 km (Figure 1), covering an area over central and eastern China. One reason for choosing such a domain was that it is well established from previous studies that the main sources of vapor for snowfall events during winter in NEC come from Southwest China and Inner Mongolia [18,20]. Another reason was that a larger domain can give WRF more freedom to develop its own synoptic and mesoscale circulations; i.e. it would increase the independence of the regional climate model from the driving data [34]. Nested inside d01, we chose a second domain (d02) with a resolution of 9 km. The grid-size of d02 was 181×187 (W-E $\times$ N-S), and it covered an area over NEC.

Four ensemble members were included in this study, and the main model configuration included the following parameterization schemes: WSM6 [35,36], LIN [37] and Thompson [38] (for microphysics); Kain-Fritsch [39,40] and Betts-Miller-Janjic [41,42] (for convective cumulus); Noah [43] and the RUC [44] (for land surface model); the CAM scheme for both short-wave and long-wave radiation [45]; and the YSU planet boundary layer scheme [46]. Table 1 summarizes the model configurations of the members.

Simulations over a 7-month period from 1 October through 1 May were conducted in the years 2009–2010. The first 5 days were considered as the spin-up period. The 6-h, 1.0-degree-grid FNL (Final) operational global analysis data provided the initial and lateral boundary conditions for the

Figure 1 Model domain and location of observational sites (black dots) for (a) the full model domain and (b) a subdomain focused over NEC. Locations of some cities are indicated by stars in (b).

Table 1 List of ensemble members with physics parameterizations

	E1	E2	E3	E4
Microphysics scheme	WSM 6	LIN	WSM6	Thompson
Convective cumulus scheme	Betts-Miller-Janjic	Kain-Fritsch	Kain-Fritsch	Kain-Fritsch
Land surface model	NOAH	NOAH	NOAH	RUC

numerical experiments. SST data, deep soil temperature and green fraction data were updated every 12 h [7,20,47]. Comparisons were made using observational temperature, precipitation and snowfall data, with temperature and snowfall data derived from station observations and rainfall data being 0.5-degree-grid rain gauge data from the China Meteorological Administration (CMA).

2 Results

The focus of the present paper is to investigate the perfor-

mance of WRF in simulating snowfall over NEC. Thus, we mainly analyze simulation and observation results from the inner domain (d02).

2.1 Temperature

Figure 2(a) shows observed and simulated 7-month-averaged temperature distributions. From the observational data, we can see that temperature gradually decreased with latitude and altitude. In the region of Liaoning Province, the temperature was relatively higher than over Inner Mongolia, a feature that can largely be attributed to the presence of the

Figure 2 (a) Seven-month averaged temperature (°C) from observation (circles) and model runs (shading) and (b) their differences. The extents of the differences are indicated using colored circles, with the meaning of the color given in the legend underneath. (c) Seven-month accumulated precipitation (mm) from observation and (d) from WRF simulations.

nearby warm ocean.

WRF was able to reasonably simulate the spatial distribution of temperature; the correlation coefficient was 0.93, with confidence levels greater than 99%. From the difference (Figure 2(b)), we can see that overall the model underestimated temperature, especially over high altitude regions. Over the region of Sanjiang Plain, for example, the level of underestimation was especially obvious.

2.2 Precipitation

Seven-month accumulated precipitation results from the model run and observations together with their relative differences are shown in Figure 2(c)–(d). The spatial pattern of cumulative precipitation from the model runs compares well with observations, with high values located over the southeastern part and mountainous areas of NEC. The spatial correlation coefficient was 0.77, with confidence levels greater than 99%. The model runs revealed more precipitation detail than observational data, owing to the higher horizontal resolution. The model-simulated precipitation results were higher than observed, especially over mountainous areas in northwestern NEC. The overestimation of the model was related to its inability to precisely catch the precipitation processes, as well as uncertainties in the observational data [48,49]. Over mountainous areas, the shortage of observation stations and uncertainties related to snowfall observation equipment adversely affected model-observation comparisons, thus demonstrating the importance of accurate measurements and a proper setup at observation stations.

2.3 Seasonal snowfall (snow water equivalent)

(i) Spatial pattern. The spatial distributions of 7-month accumulated snowfall from observation and model simulations are shown in Figure 3. As can be seen from the ob-

served data, the pattern was quite similar to that of precipitation, with high values in the southeastern part and mountainous areas of NEC. The simulated snowfall followed the observed results well, with a spatial correlation coefficient of 0.73, at confidence levels greater than 99%. Meanwhile, greater detail relating to snowfall distribution could be found in the WRF simulation, especially for orographic snowfall in eastern NEC. The model-simulated snowfall was higher in northern NEC, but lower in southern NEC, compared to observations. In the central part of NEC, simulated results compared well with observed data, with a relative error of less than 25%. The regions with higher snowfall in Figure 3(b) reflect closely the cooler areas in Figure 2(b), indicating a significant relationship between snowfall and temperature. Lower temperatures are favorable for the formation and intensification of snowfall.

(ii) Temporal distribution. Figure 4(a) shows daily snowfall amounts from observation stations in d02 (i.e. observed results), along with the average of four retrospective simulations. The daily snowfall amount is the sum of all the stations. The main temporal feature revealed from the observed data is a bimodal distribution, with more snowfall in late autumn and early spring, and less in winter. The simulated results reflect this feature well, with a spatial correlation coefficient of 0.93, at confidence levels greater than 99%. Furthermore, simulated extreme snowfall events compared well with observation, indicating WRF did a good job in this regard.

2.4 Impacts of horizontal resolution

To investigate the impacts of horizontal resolution on WRF-simulated snowfall accumulation, the daily time series of accumulated snowfall based on 9- and 27-km grid spacing simulations over the same domain (d02) is shown in Figure 5. As can be seen from these data, the 9- and 27-km simulations

Figure 3 Same as in Figure 2(a) and (b), but for snow water equivalent (mm).

Figure 4 Daily time series of snowfall amount (mm) for (a) 9-km- and (b) 27-km-grid simulations. The daily amount is the sum of station snowfall inside each domain.

Figure 5 Time series of accumulated snowfall amount (mm) for stations in the same domain (d02): observed (black line) and model simulations (red and blue lines).

followed observed results well, with spatial correlation coefficients of 0.93 and 0.91 respectively, at confidence levels greater than 99%. However, the 27-km model run result was overall lower than observation; the underestimation was quite obvious during the 7-month period. The 9-km simulation compared well with observation, except for an overestimation of intense snowfall in the middle of March (Figure 4(a)). The comparison indicates that an increasing level of snowfall as the model resolution increases is evident in WRF simulations.

The daily time series of snowfall amount based on 27-km grid spacing simulations over the outer domain (d01) was also investigated, and the results are shown in Figure 4(b). Simulated results were lower than observed, especially for extreme snowfall events. A comparison between Figure 4(a) and (b) indicates that better performance can be achieved with higher horizontal resolution.

2.5 Impact of physics parameterizations

In the simulations reported upon thus far, two land-surface,

three microphysics, and two cumulus convection parameterization schemes were used. A series of experiments using different combinations of schemes were also conducted to investigate the impact of physics parameterizations on WRF simulation. Unlike the previous simulations, which were run under 9- and 27-km grid spacings, these simulations focused on the outer domain (d01). The results of each physics parameterization scheme were ensemble means of all the experiments that contained the scheme in question. For example, the result based on Noah was the ensemble mean of the LBN, TBN, WBN, LKN, TKN and WKN experiments listed in Table 2.

The impacts of physics parameterizations were more readily discerned by listing the model averages, biases and spatial correlation coefficients of all stations, as shown in Table 3. To calculate the average amount simulated by WRF, the result of the nearest grid to the observation station was selected as the model result. Obvious model dependence on physics parameterization schemes can be seen from Table 3; however, we cannot find one experiment that was best among all the experiments in all aspects. WBN, WKN

Table 2 List of numerical experiments with various physics parameterizations

Expt	Land surface	Microphysics	Cumulus convective
LBN	Noah	Lin	Betts-Miller-Janjic
TBN	Noah	Thompson	Betts-Miller-Janjic
WBN	Noah	WSM6	Betts-Miller-Janjic
LKN	Noah	Lin	Kain-Fritsch
TKN	Noah	Thompson	Kain-Fritsch
WKN	Noah	WSM6	Kain-Fritsch
LBR	RUC	Lin	Betts-Miller-Janjic
TBR	RUC	Thompson	Betts-Miller-Janjic
WBR	RUC	WSM6	Betts-Miller-Janjic
LKR	RUC	Lin	Kain-Fritsch
TKR	RUC	Thompson	Kain-Fritsch
WKR	RUC	WSM6	Kain-Fritsch

Table 3 Comparison of model averages, biases and spatial correlation coefficients of the experiments^{a)}

Expt	Average (mm)	Bias (mm)	Relative bias (%)	Correlation coefficient
OBS	26.18	—	—	—
LBN	24.8	−1.37	−5.25	0.89**
TBN	13.03	−13.14	−50.22	0.72*
WBN	32.73	6.55	25.04	0.91*
LKN	25.41	−0.76	−2.92	0.89**
TKN	20.44	−5.74	−21.92	0.84**
WKN	31.8	5.62	21.49	0.9**
LBR	22.12	−4.05	−15.48	0.88**
TBR	14.55	−11.63	−44.43	0.82**
WBR	59.55	33.37	127.49	0.9**
LKR	22.3	−3.88	−14.82	0.88**
TKR	18.41	−7.76	−29.66	0.8**
WKR	53.09	26.91	102.82	0.89**

a) *, >95% confidence level; **, >99% confidence level.

and WBR showed better performance in terms of their spatial correlation coefficients; LBN and LKN were better in terms of relative bias; while for snowfall accumulation LBN and LKN were relatively better, and TBN, WBR and WKR were relatively worse.

A comparison of time series of accumulated snowfall amounts for different physics parameterization schemes is shown in Figure 6. From the land surface model series experiments (Figure 6(a)), we can see that Noah reflected observations very well, while RUC greatly overestimated snowfall amounts. From Figure 6(b) we can see that the simulation from Lin followed the observed data well, that WSM6 showed an obvious overestimation, and that Thompson underestimated compared to observations. Betts-Miller-Janjic and Kain-Fritsch were quite similar to each other, with little overestimation. The WRF model showed an obvious dependence on physics parameterization schemes, and is more sensitive to microphysics and land surface schemes compared to the choice of convective cumulus parameterization scheme. The strong sensitivity to micro-

Figure 6 Comparison of time series of accumulated snowfall amount (mm) for stations over the same domain (d01): observed (black line) and simulated (red and blue lines).

physics and land surface schemes largely results from land surface coupling and ice-phase microphysical processes [33,50], all of which, in turn, influence snowfall simulation.

3 Conclusions

This study examined the performance of the WRF model in

simulating seasonal snowfall over NEC. The influences of horizontal resolution and parameterization schemes were investigated. The results indicate that WRF can reasonably reproduce the main features of temperature and precipitation. The spatial and temporal distribution of snowfall can also be well reproduced. However, an underestimation of temperature and an overestimation of precipitation were found, and these uncertainties in simulation indicate the importance of high-resolution observation data [51]. A higher resolution can achieve better model performance, and WRF was found to be more sensitive to the choice of microphysics parameterization scheme and land surface model compared to the convective cumulus parameterization scheme used when simulating seasonal snowfall. Noah and Lin showed better performance among the physics schemes.

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