FINAL REPORT

High-Spatial-Resolution
Passive Microwave Sounding Systems

NASA Grant NAG 5-10

covering the period
February 1, 1980- March 14, 1994

Submitted by
D. H. Staelin and P. W. Rosenkranz

November 1, 1994

Massachusetts Institute of Technology
Research Laboratory of Electronics
Cambridge, Massachusetts 02139
ABSTRACT

The principal contributions of this combined theoretical and experimental effort were to advance and demonstrate new and more accurate techniques for sounding atmospheric temperature, humidity, and precipitation profiles at millimeter wavelengths, and to improve the scientific basis for such soundings. Some of these techniques are being incorporated in both research and operational systems.

Specific results include: 1) development of the MIT Microwave Temperature Sounder (MTS), a 118-GHz 8-channel imaging spectrometer plus a switched-frequency spectrometer near 53 GHz, for use on the NASA ER-2 high-altitude aircraft, 2) conduct of ER-2 MTS missions in multiple seasons and locations in combination with other instruments, mapping with unprecedented ~2-km lateral resolution atmospheric temperature and precipitation profiles, atmospheric transmittances (at both zenith and nadir), frontal systems, and hurricanes, 3) ground based 118-GHz 3-D spectral images of wavelike structure within clouds passing overhead, 4) development and analysis of approaches to ground- and space-based 5-mm wavelength sounding of the upper stratosphere and mesosphere, which supported the planning of improvements to operational weather satellites, 5) development of improved multi-dimensional and adaptive retrieval methods for atmospheric temperature and humidity profiles, 6) development of combined non-linear and statistical retrieval techniques for 183-GHz humidity profile retrievals, 7) development of non-linear statistical retrieval techniques for precipitation cell-top altitudes, and 8) numerical analyses of the impact of remote sensing data on the accuracy of numerical weather predictions; a 68-km gridded model was used to study the spectral properties of error growth.
# TABLE OF CONTENTS

<table>
<thead>
<tr>
<th>Section</th>
<th>Page</th>
</tr>
</thead>
<tbody>
<tr>
<td>1. Introduction</td>
<td>4</td>
</tr>
<tr>
<td>2. MIT Millimeter-wave Temperature Sounder</td>
<td></td>
</tr>
<tr>
<td>A. Instrument Description</td>
<td>4</td>
</tr>
<tr>
<td>B. ER-2 Experiments</td>
<td>5</td>
</tr>
<tr>
<td>C. Ground-based Measurements</td>
<td>7</td>
</tr>
<tr>
<td>D. Upper Stratosphere Sounding Possibilities</td>
<td>7</td>
</tr>
<tr>
<td>3. Retrieval Theory and Atmospheric Structure</td>
<td></td>
</tr>
<tr>
<td>A. Water-vapor Profiles</td>
<td>7</td>
</tr>
<tr>
<td>B. Two-and Three-Dimensional Filtering</td>
<td>8</td>
</tr>
<tr>
<td>C. Atmospheric Structure and Estimation of Temperature Fields</td>
<td>8</td>
</tr>
<tr>
<td>D. Impact of High Spatial Resolution Data on Numerical Weather Prediction</td>
<td>9</td>
</tr>
<tr>
<td>E. Retrieval of Precipitation Cell-top Altitude</td>
<td>10</td>
</tr>
<tr>
<td>References</td>
<td>11</td>
</tr>
</tbody>
</table>
1. **INTRODUCTION**

This research project had as its primary objective the development of techniques and theory for measurement of the atmosphere by passive microwave instruments at high spatial resolution. These techniques could eventually be applied to satellite systems. A particular motivation for the work was the planned launch of the Advanced Microwave Sounding Unit (AMSU) on NOAA satellites. A major supporting component of the work reported here was the development of an imaging microwave spectrometer system and its operation on the ground and on a NASA high-altitude aircraft. These microwave observations provided data for studies of clouds, precipitation, and temperature, which are reviewed in Section 2. Section 3 describes several related studies of retrieval techniques which were supported either in whole or in part by this grant.

2. **MIT MILLIMETER-WAVE TEMPERATURE SOUNDER**

A. **Instrument Description**

The Millimeter-wave Temperature Sounder (MTS) is a dual-band 53/118-GHz microwave radiometer system for the measurement of atmospheric temperature and other phenomena affecting transmission in the microwave absorption bands of molecular oxygen. It is an improved version of an earlier fixed-beam 118-GHz sounder built at MIT and operated aboard NASA's Convair 990 (Ali, et al., 1980). Figure 1 is a block diagram of the present system. The instrument is capable of either downward- or upward-viewing operation on the NASA ER-2 high-altitude aircraft, and also ground-based operation. It has a scanhead, installed in the aft cone of the ER-2 wing superpod, which houses the RF components and a video camera. IF amplifiers, synchronous detectors, integrators, power supplies, temperature controllers, video recorder, and a microcomputer are housed in the midsection of the superpod.

One radiometer is an eight-channel scanning spectrometer with its local oscillator centered on the 118.75 GHz oxygen line. It is a double-sideband superheterodyne system. The eight channels are derived from filters in the IF section, with characteristics given in Table 1. Thus each channel has two symmetrically placed passbands on the sides of the line. Figure 2 shows the weighting functions associated with each channel for the nadir view. This
spectrometer has a stationary scalar feedhorn and subreflector with 7.5° beamwidth which view a step-scanning mirror. The mirror directs energy from a sequence of 14 positions, extending over a 95° angular sector below the aircraft, and also from two calibration targets, into the spectrometer. The integration time per spot is 224 ms, yielding ~ 0.5 K radiometric temperature sensitivity per spot. A scan cycle lasts 5.5 seconds.

The second radiometer is a single-channel (ch.0) fixed-beam nadir-viewing double-sideband superheterodyne system. The antenna has a 10° beamwidth. The local oscillator is tunable under computer control from 52 to 54 GHz. A typical mode of operation would time-share between three or four local-oscillator frequencies, covering roughly the same range of altitudes as the 118 GHz weighting functions. Internal loads are used for calibration of this radiometer.

<table>
<thead>
<tr>
<th>Table 1. MTS channels' passband specifications.</th>
</tr>
</thead>
<tbody>
<tr>
<td>Channel 0: L.O. frequency tunable, 52-54 GHz</td>
</tr>
<tr>
<td>Channel 1-8: L.O. frequency fixed, 118.75 GHz</td>
</tr>
</tbody>
</table>

<table>
<thead>
<tr>
<th>Channel</th>
<th>I.F. Center Freq. (MHz)</th>
<th>I.F. Width (MHz)</th>
</tr>
</thead>
<tbody>
<tr>
<td>0</td>
<td>115</td>
<td>170</td>
</tr>
<tr>
<td>1</td>
<td>660</td>
<td>170</td>
</tr>
<tr>
<td>2</td>
<td>840</td>
<td>210</td>
</tr>
<tr>
<td>3</td>
<td>1040</td>
<td>240</td>
</tr>
<tr>
<td>4</td>
<td>1260</td>
<td>220</td>
</tr>
<tr>
<td>5</td>
<td>1470</td>
<td>240</td>
</tr>
<tr>
<td>6</td>
<td>1670</td>
<td>220</td>
</tr>
<tr>
<td>7</td>
<td>1900</td>
<td>270</td>
</tr>
<tr>
<td>8</td>
<td>500</td>
<td>125</td>
</tr>
</tbody>
</table>

R. ER-2 Experiments

During the period covered by this grant we participated with the MTS in several NASA experiments involving the ER-2 high-altitude research aircraft. These are listed in Table 2. MTS measurements and retrieved parameters from these experiments have been described by Gasiewski (1988), Gasiewski and Staelin (1989, 1990), Gasiewski, et al. (1990), Bonnani (1991), and Schwartz et al., (1994a, b). The major results of these papers are summarized below.

Figure 3 shows MTS measurements in a flight track over a series of convective cells during COHMEX. The inset in this figure is an expanded scale showing small perturbations in the two most transparent channels over the visibly opaque cirrus anvil, extending from points A to B, of the rain cell which peaked at C. The cirrus anvil top was at 13-km altitude. The region to the left
of A was visibly clear. These results indicate that the 118-GHz line could be used to infer temperature profiles through thick cirrus clouds, but not through rain. Theoretical calculations of radiative transfer in precipitation cell models (Gasiewski and Staelin, 1990) showed that both liquid and ice phases play significant roles in reproducing measured spectra such as those in Figure 3.

Table 2. Aircraft Experiments

<table>
<thead>
<tr>
<th>Experiment</th>
<th>Dates</th>
</tr>
</thead>
<tbody>
<tr>
<td>GALE</td>
<td>February, 1986</td>
</tr>
<tr>
<td>COHMEX</td>
<td>June-July, 1986</td>
</tr>
<tr>
<td>CAPE</td>
<td>July-August, 1991</td>
</tr>
<tr>
<td>STORMFEST</td>
<td>February-March, 1992</td>
</tr>
<tr>
<td>SSMT-2 Underflights</td>
<td>(West Coast) May;</td>
</tr>
<tr>
<td></td>
<td>(East Coast) July-August, 1992</td>
</tr>
<tr>
<td>TOGA-COARE-test flights</td>
<td>January-February, 1993</td>
</tr>
<tr>
<td>CAMEX</td>
<td>September-October, 1993</td>
</tr>
</tbody>
</table>

Two hurricanes were overflown with the ER-2: Bob in the North Atlantic in August, 1991, and Oliver in the Coral Sea in February, 1993. Figure 4 displays MTS images of Oliver, as deviations from clear-air brightness temperatures outside the storm (Schwartz, et al., 1994b). These images show a strong response, in the lower-atmosphere channels, to the precipitation in the eyewall and also show smaller cold perturbations from nearby rainbands. At equal pressure levels the clear air inside the eye is warmer than outside. The ~10-K magnitude of the warming over a region of ~50-km diameter in channels 8 and 1 (which are not affected by precipitation) implies that the AMSU-A sounder on future NOAA satellites will be able to monitor the strength of ordinary hurricanes similar to Oliver.

Methods for detection of buoyancy waves in the MTS data were studied by Bonanni (1991). After screening out interference, 14 wavelike events were identified in the GALE and COHMEX datasets, but the largest peak-to-peak amplitude was 0.17 K.

Downlooking measurements with MTS seemed to imply more absorption around 118 GHz than predicted (Gaswieski, 1988). To test this hypothesis, the ER-2 superpod was modified to allow our instrument to be mounted looking upward, and several flights were made this way in 1991-93. This configuration has greater sensitivity to changes in atmospheric opacity. The data is still being analysed, but preliminary results (Schwartz, et al., 1994a) do indicate greater atmospheric opacity at altitudes of 10-20 km. The implications of this, in terms of adjustments to line parameters, is a subject of continuing investigation.
C. **Ground-based Measurements**

The MTS was operated on the ground at Fryeburg, ME in January 1987, observing zenith. This location is ~38-km southeast of Mt. Washington. Repeated occurrences of periodic disturbances in 118-GHz brightness temperature were observed (Bonanni, 1991) during visually opaque conditions at the onset of snowfall. These disturbances were determined to be the effect of modulation of atmospheric opacity due to either water vapor or liquid water (wet snow). The evidence may favor the latter because the fractional changes required in water vapor (~30 percent) are larger than those required in liquid water (~0.007 gm$^{-3}$ in 6-km layer).

D. **Upper Stratosphere Sounding Possibilities**

Upper-atmospheric emission from the strong oxygen lines cannot be observed either from the surface or from aircraft because the lower atmosphere is opaque. However, on the wings of the 60 GHz band (e.g. 52 to 54 GHz), the opacity of the lower atmosphere is small enough to permit observation of stratospheric emission from lines arising in higher rotational levels (Waters, 1973). Within a few MHz of the line centers, thermal emission from oxygen microwave lines has (in general) partial elliptical polarization, becoming circular for observation along a field line and linear for transverse observations. The polarized component originates at altitudes above 40 km, where line widths are comparable to or less than the Zeeman splitting (Rosenkranz and Staelin, 1988).

At any frequency, most of the brightness temperature is emitted from the lower atmosphere. Therefore, one takes the difference of two measurements, either at different frequencies or different polarizations, to measure the high-altitude emission. The vertical distribution of contributions to this brightness-temperature difference is a contribution function. To obtain a reasonable signal-to-noise ratio, one averages over a finite bandwidth, and thus one may generalize the differencing operation to integration over frequency with antisymmetric weighting. Figure 5 displays a normalized contribution function for left-circular-polarized observations of the 27- line, using a 3.82-MHz wide spectrum weighting function centered at -0.5 MHz from the line center (Rosenkranz, 1990). With a receiver noise temperature of 1300 K, it would be possible to obtain sensitivity to stratopause region temperature of 1 K rms in 20 minutes observation at the surface.

In preparation for future observations of this line, we built a 32-channel autocorrelator board for the computer, using VLSI 2-bit autocorrelator chips (Petro, 1989). Figure 6 is a block diagram of a spectral-line system design.

3. **RETRIEVAL THEORY AND ATMOSPHERIC STRUCTURE**

A. **Water-vapor Profiles**
A method for retrieval of water vapor profiles from measurements in the vicinity of the 183-GHz line was developed (Komichak, 1982; Rosenkranz, et al., 1982). The basis of this method is interpolation of two temperature profiles, as shown in Fig. 7. The profile of temperature as a function of water vapor burden (defined as vertically integrated column density overhead) is obtained by linear-least-square estimation using radiometer channels at 90-183 GHz, and the profile of temperature as a function of pressure is obtained from channels at 50-60 GHz. The result of the interpolation is a profile of water vapor burden as a function of pressure. Although this profile could be regarded as an end product, it was used as input to a linear-least-square estimator of relative humidity.

Water vapor profiling was subsequently developed further in papers by Kuo, et al., (1994) and Cabrera-Mercador and Staelin (1994), with support from other grants.

B. Two-and Three-Dimensional Filtering

This work applied the principles of multi-dimensional spatial Wiener filters to the geophysical retrieval problem. The implementation of these filters was done by a fast Fourier transform of radiometric measurements in the spatial domain, followed by linear-least-square estimation of geophysical parameters at each spatial frequency, followed by inverse Fourier transformation.

Applied to Scanning Multichannel Microwave Radiometer data, this approach provided a rigorous treatment of the problem of different antenna beam widths at different frequencies (Rosenkranz, 1982). In this case the filter had two spatial dimensions and one dimension of channel number, which maps into geophysical parameters. The retrieved parameters were sea surface temperature, near-surface wind speed, integrated water vapor, integrated liquid water, and characteristic drop radius.

Applied to Microwave Sounder Unit (MSU) measurements by Nathan, et al., (1985), a two-dimensional spatial filter gave as much as 25% lower temperature profile errors than the conventional one-dimensional least-square estimator. Here the first dimension is altitude (or channel number) and the second dimension is distance along the orbital track. In this problem, the conventional estimator can use only the vertical correlation of atmospheric temperature, whereas the spatial filter had the advantage also of using horizontal correlation.

C. Atmospheric Structure and Estimation of Temperature Fields

Toldalagi (1980) showed how time-varying Markovian models could be derived from atmospheric general circulation models, and then be used to adapt Kalman filters for temperature profile retrievals. The resulting improvements were too modest relative to fixed global Kalman filters to warrant their complexity.
Related attempts to improve temperature profile retrieval performance using tropopause height as input to a linear retrieval (Komichak, 1980) were also insufficiently rewarding; non-linear retrieval techniques might utilize such information more efficiently. Greater improvements (-5-50\%) were obtained by Bauman (1980), who used linear retrievals updated by recent geographical relevant observations of measurement means and covariances.

Briancon (1986) further extended the theory of multidimensional retrievals by developing a model for the three-dimensional covariance of temperature, and using it to predict the performance of estimation operators whose supporting domain was finite, infinite, or semi-infinite (Kalman filters). The use of horizontal correlations in various estimation schemes produced typically 15 to 25 percent reduction of rms errors for MSU, and 5 to 10 percent reduction for AMSU (in simulations). Adaptive retrieval operators for nonstationary processes were also considered, and criteria for optimizing these operators were found.

D. Impact of High Spatial Resolution Data on Numerical Weather Prediction

The University of Wisconsin primitive-equation forecasting model was used to study the growth of errors as a function of time and resolution of the data assimilated into the model. The method was to measure the response of the model as a function of wavenumber, by adding geostrophically-balanced perturbations of temperature and wind at various three-dimensional spatial frequencies to the initial fields, and subtracting a control with no perturbations from the perturbed forecasts. Figure 8 shows predicted temperature error energy, summed over 10 levels, as a function of forecast time, with the temperature measurement resolution \( K_0 \) as a parameter. At wavenumbers \( \geq K_0 \) the initial errors are equal to the energy spectrum of the atmosphere, while for wavenumbers \( < K_0 \), the initial errors result from aliasing. As forecast time increases, errors at all frequencies approach the atmospheric variance due partly to chaotic turbulence processes. Note that from the Nyquist criterion, the distance between measurements is \( 0.5 \times 10^6 \text{m}/K_0 \).

Using these results, a new statistical model for error evolution in numerical prediction models was formulated to approximate our observations of error behavior in a University of Wisconsin (Madison) adaptation of a primitive-equations model with limited area, nesting, and semi-implicit time differencing with ten sigma levels (0.09-0.99); grids of 135.2 and 67.6 km were used for the continental U.S. The deduced limit on predictability \( D \) (days) is:

\[
D < \left( \lambda_{\text{max}} / 300 \right) \left( 1 - 2 \left( 1 - \lambda_{\text{max}} / \lambda_{\text{min}} \right) \right)
\]

where distances are in kilometers and the equation was deduced from experiments with \( \lambda \) between 135 and 1090 km. The equation assumes we have perfect
knowlege at time zero for wavelengths longer than $\lambda_{\text{max}}$ and zero knowledge otherwise, corresponding to a mean-square difference $E$ between the known temperature field and truth, and that at $t = 0^+$ we learn the true atmosphere for wavelengths longer than $\lambda_{\text{min}}$, thus reducing $E$ to $E'$. The limit $D$ is the number of days for which a perfect prediction model could yield an expected mean-square error $E''$ for the predictions which is less than $E$. Choice of $\lambda_{\text{max}}$ specifies the scale sizes of interest to us in the predictions, and the choice of $\lambda_{\text{min}}$ specifies the spatial resolution of the initialization data for the numerical prediction model. Use of this equation for synoptic scale predictions ($\lambda_{\text{max}} = 3000 \text{ km}$) suggests that AMSU resolutions of $100 \text{ km}$ will not much improve $D(\sim 10 \text{ days})$ over RAOB-based forecasts with $\lambda_{\text{min}} = 600 \text{ km}$ resolution, whereas for mesoscale forecasts with $\lambda_{\text{max}} = 1200 \text{ km}$ the indicated values of $D$ drop from 4 days for 600-km RAOBs to 2 days with AMSU resolution (100 km).

E. Retrieval of Precipitation Cell-top Altitude

MTS brightness temperature perturbations (cell-center $T_B$ minus clear-air $T_B$), obtained over precipitation cells such as those shown in Figure 3 were used to develop a technique to infer cell-top altitudes. The algorithm, described by Gasiewski and Staelin (1989), consists of a Karhunen-Loeve transformation and rank reduction of the $T_B$ perturbations, followed by a nonlinear operation and then a linear least-square regression of the transformed variables against the visible cell top altitude, which was measured by stereoscopy using the simultaneous video imagery.

Figure 9 shows the accuracy of the retrieval on an ensemble of 279 independent spectra from GALE and COHMEX. The rms discrepancy between retrieved and visible altitudes is 1.97 km. Part of this scatter is due to an uncertainty of $\sim 1 \text{ km}$ in the optical cell-top altitude. Additional work on the accuracy of cloud height estimates using video stereoscopy from the NASA aircraft was performed by Bayer (1988).

Subsequent work, funded by another grant, on retrieval of cell-top altitudes with a neural network has yielded improved results (Spina, 1994: Spina, et al., 1994). Earlier work by Jin (1981) focused on cloud measurements using Tiros-N MSU data, including the 53.75-GHz channel.
PUBLICATIONS AND THESIS SUPPORTED BY THIS GRANT


Other References


Figure 1. MTS instrument block diagram.

Figure 2. MTS weighting functions near 118 GHz.

Figure 3. Brightness temperatures observed near nadir by MTS on July 8, 1986, on a track over a series of convective cells (Gasiewski et al., 1990).

Figure 4. MTS brightness temperature perturbations (K) over Cyclone Oliver.

Figure 5. Normalized contribution function for observation of the 27- oxygen line.

Figure 6. Proposed spectral-line system.

Figure 7. Illustration of the method of obtaining the water vapor burden $u$ as a function of pressure $P$, given two estimated temperature profiles.

Figure 8. Predicted total temperature error energy versus forecast time, with measurement system resolution $K_0$ as a parameter.

Figure 9. Retrieved cell-top altitude versus altitude estimated by optical stereoscopy (Gasiewski and Staelin, 1989).
Figure 1. MTS instrument block diagram.
Figure 2. MTS weighting functions near 118 GHz.
Figure 3. Brightness temperatures observed near nadir by MTS on July 8, 1986, on a track over a series of convective cells (Gasiewski et al., 1990).
Figure 4. MTS brightness temperature perturbations (K) over Cyclone Oliver.
Figure 5. Normalized contribution function for observation of the 27- oxygen line.
Figure 6. Proposed spectral-line system.
Figure 7. Illustration of the method of obtaining the water vapor burden $u$ as a function of pressure $P$, given two estimated temperature profiles.
Figure 8. Predicted total temperature error energy versus forecast time, with measurement system resolution $K_0$ as a parameter.
Figure 9. Retrieved cell-top altitude versus altitude estimated by optical stereoscopy (Gasiewski and Staelin, 1989).