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**Internet of Things for Environmental Sustainability and Climate Change**

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Chapter 2
Internet of Things for Environmental Sustainability and Climate Change

Abstract  Our world is vulnerable to climate change risks such as glacier retreat, rising temperatures, more variable and intense weather events (e.g., floods, droughts, and frosts), deteriorating mountain ecosystems, soil degradation, and increasing water scarcity. However, there are big gaps in our understanding of changes in regional climate and how these changes will impact human and natural systems, making it difficult to anticipate, plan, and adapt to the coming changes. The IoT paradigm in this area can enhance our understanding of regional climate by using technology solutions, while providing the dynamic climate elements based on integrated environmental sensing and communications that is necessary to support climate change impacts assessments in each of the related areas (e.g., environmental quality and monitoring, sustainable energy, agricultural systems, cultural preservation, and sustainable mining). In the IoT in Environmental Sustainability and Climate Change chapter, a framework for informed creation, interpretation and use of climate change projections and for continued innovations in climate and environmental science driven by key societal and economic stakeholders is presented. In addition, the IoT cyberinfrastructure to support the development of continued innovations in climate and environmental science is discussed.

2.1 Introduction

The global climate is changing rapidly mainly because of the human activities over the period of last five decades [80, 137]. This change is project to continue in the foreseeable future depending on the heat-trapping gas emissions in the environment and sensitivity of the climate of the Earth on these emissions [108]. From 1895 to 2020, an increase of 1.3–1.9 °F in average temperature has been observed in the USA with substantial increase after the year 1970 [7, 25, 110]. The change in global annual mean surface-air temperatures (ocean and land combined) is shown in Fig. 2.1. An increase of 8 in. has been observed in global sea levels since 1880 with a projected increase of up to 4 ft by the end of this century. The ice covered areas (surface extent) in sea, land, and lakes are decreasing with increase in temperature [63, 116]. The warmest month records are being
 Broken consistently and human caused global warming combined with natural changes in climate is making too difficult to accurately predict climate variations [8, 79, 117, 119, 124]. Accordingly, due to the interdependence of the growing season on the frost-free period, the length of growing season has been increased and will continue to increase [4, 30, 38, 62, 68, 74, 142, 157, 158, 173]. Moreover, the average precipitation has increased with corresponding increase in intensity of the extreme downpours and precipitation [7, 94, 128, 139, 151]. Furthermore, more variations are being observed in extreme weather occurrence patterns (e.g., the frequency of the cold waves have decreased but its intensity has increased) [9, 32, 44, 55, 83, 120, 146]. Similarly, the same patterns are being observed for droughts and flooding, where droughts intensity has increased [49, 82, 121]. Since 1980, the hurricanes have become more frequent and intense spanning over longer duration which is also related to the heavy downpours and intense storms [20, 43, 106]. The frequency and intensity of the winter storms, damaging winds, thunderstorm, and tornadoes are also the subject of climate change investigation [17, 65, 112, 155]. The ocean acidification (the decrease in the pH levels of the oceans) is increasing due to the one-fourth absorption of the atmospheric carbon dioxide emission in oceans which is impacting marine echo system [33]. The change in annual mean surface-air temperatures in USA is shown in Fig. 2.2.

The IoT is being envisioned as an effective tool to combat the climate change [81]. Through its sensing and monitoring capabilities, it provides insights into root cause of climate change by sensing the amount of CO₂ and different greenhouse gases in our atmosphere [150]. The emissions of greenhouse gases from burning of fossil fuels can be sensed in real time. Accordingly, the carbon sequestration processes and rates can be monitored to increase the storage of carbon captured in forests which helps to offset emissions. Furthermore, the novel atmospheric “things” and technology can be developed to permanently reduce the atmospheric CO₂ with integration into the climate IoT.
The climate IoT is also useful in climate change anticipation and adaption preparation. Its sensing and communication technologies coupled with prediction systems and models clear uncertainty and provide useful insights into the exact nature of the climate changes. The IoT enabled climate decision making tools can predict predicting how the climate will change and how the ecosystem is likely to respond to the climate change and other factors affecting it. The IoT technology has enabled empirical investigations on impacts of elevated greenhouse gases [126]. It also supports simulations of ecosystem’s response in different climatic conditions (both current and future). With this new knowledge the environmental and atmospheric management practices are tailored and accordingly novel management techniques can be developed. By utilizing the contemporary scientific and technological advancements, the climate IoT has the potential to meet immediate and long-term goals and applications needs. This architecture provides better understanding and insights into the global ecosystems and supports informed decision making. This enhanced understanding of the Earth system from universal to regional scales has the potential to enhance our ability to assess water resources, predict weather patterns, forecasts climate, and increased understanding of ecosystem health. The impact of these factors on our community determines the need of development of applications utilitarian to the society.

2.2 Climate Change IoT Things for Environmental Sustainability

The worldwide environment consists of the atmosphere, ecosystems, air quality, hydrosphere, lithosphere, atmosphere chemistry, chromosphere, biosphere, land and ocean bio-geochemical processes [77]. The following climate change elements
2.3 Climate IoT as the Sustainability Enabler Framework

2.3.1 Holistic System

The integration of sensors, communication technologies, reporting, prediction, and forecasting and surface meteorological systems in the environmental sustainability and climate change IoT paradigm has many potential benefits [159]. Novel
visualization and decision-support tools for changes in ocean temperature, coastal inundation, and sea-level at decision-relevant scale can be developed for real-time analysis using multi-radar and multi-sensors IoT elements. These systems will serve as indicators of climate impacts on ocean and coastal resources and other sectors which will aid in enhanced weather forecasting using adaptive atmospheric sensing and sampling and radar technology with resolution of 10,000 m for deterministic forecast and 20,000 m for ensemble forecast.

2.3.2 Novel Sensing Methods

The data from new sensors and robotic floats for biogeochemical, biooptical, and pH measurements can be fused in the cloud for real-time analysis [104]. The multi-dimensional atmospheric analysis prototypes can be integrated into the system with data assimilated from wide area meteorological zones for providing robust warnings using real-time radar sampling techniques. The environmental sustainability and climate change IoT paradigm can help prototyping the weather and fire behavior modeling system for local firefighting applications. The climate IoT paradigm brings improvements in accurate understanding and better planning by enabling climate forecasts at multi-time-scales, projections of future climate trends and change for support policy decisions. It enables integration of following sensing and monitoring systems.

2.3.3 Solar Radiation and Soil Moisture Data

In environmental sustainability and climate change IoT paradigm, the solar radiation and soil moisture data can be linked for improved insights into the wind, water content, and temperature profiles [37]. The aerial sensing systems composed of different types of sensors (e.g., LiDAR, Doppler radar, spectrometer, dropsondes [131], and radiometer) also provide diverse insights [91, 156]. These observations are useful to fill gaps in measurements of different parameters of water cycle including water vapor transport, precipitation, snow, river flow, sea-ice, waves, water level, and surface energy budget terms including evapotranspiration and aerosols. Moreover, the impact of natural changes such as solar and volcanic activities, varying aerosols and greenhouse gases radiative forcing can be observed at large scale.

- Tropical and extra tropical oceans and cyclones, ocean basin, and sea levels
- Storm surges, droughts, heat waves, and wildfires
- Land-based ice sheets and hydrologic cycle
- Simulations of ocean, atmosphere, and land-surface processes
- Surface albedo, water vapor, clouds, and geomagnetic conditions
• Temperature, precipitation, extreme events, and pollution
• Air quality modeling, wildfires, and dust storms

2.3.4 **Forecasting Models**

For understanding and predicting the impacts of climate variabilities, extreme and precipitate climate changes, there is a strong need of full range of tools for environmental prediction and projection forecasts on different spatial and temporal scales [11, 123]. The climate IoT paradigm is also useful to ascertain the effects of the slowly changing Arctic Oscillation (AO) weather patterns through simulations [8]. New insights can be gained about the impact of ocean-atmosphere link on weather forecast through interconnection if these currently disjoint systems [40]. Similarly, it enables hurricane inner nest for global forecasting system. The advantages of multi-model, stochastic-, and multi-physics ensemble generation can be realized with novel methods of uncertainty condition representation [2]. Moreover, with the data obtained from the sensing and monitoring systems, the advanced statistical models can be developed for reliability improvement (e.g., tropical storm and extra-tropical storm inundation model) [59, 111, 118, 143]. It also enables development of new disciplines such as storm behavior climatologies by providing access to data collected over span of multiple decades. Furthermore, prototypes of high resolution climate models and prediction systems can be developed including novel downscaling methods for climate systems across different temporal/spatial scales [12, 42, 48, 49, 51, 138]. The data assimilation process in ionosphere and thermo-sphere in forecast models can provide better insights. A global climate grid scale model is shown in Fig. 2.4. Other important models are listed below:

• Route inundation storm surge
• Storm scale
• Geospace model in local geomagnetic storm
• Radiation environment at aviation and orbital altitudes
• Assimilative models
• Ionosphere plasmasphere
• Wind energy
• Coupled human and natural systems

2.3.5 **Emissions Monitoring**

The black carbon, methane, and nitrous oxide emissions can be quantified through climate IoT sensing techniques with high certainty [10, 45, 58, 75, 90, 92, 93, 101, 149, 154, 167, 170]. Accordingly it impact on the environment and clouds can be
assessed by developing reliable flux estimates. The impact of four replacement compounds on extremely high ozone layer, surface air quality, and climate can be evaluated for solvents, refrigerants, and other blow agents [13, 16]. It also enables air chemistry assessment of effects of urban, gas, and oil development emissions on urban air quality [144]. Moreover accurate models can be developed to quantify climate sink and forcing for the following:

- Atmospheric aerosols
- Greenhouse gases
- Aerosol interactions
- Stratospheric chemistry
2.4 Climate Communication Technologies and Systems

With the advancement in systems development, many novel atmospheric monitoring and mapping, and communications technologies have been developed. These are discussed in the following section.

2.4.1 Doppler Radar

Data about the velocity remote objects can be obtained using a special type of radar that measures the Doppler effects [23, 95]. A microwave EM signal is transmitted from the radar towards the desired target that is in motion [22, 41]. The frequency of returned signal (bounced from the object) is analyzed to get accurate measurement of target speed.

The Doppler effect can be produced using four different methods:

- Coherent pulsed (CP)
- Pulse-Doppler
- Continuous wave (CW)
- Frequency modulation (FM)

The narrow-band filters are employed in Doppler radars to cancel interference from low speed and immobile objects (e.g., birds, clouds, insects, and wind) (Fig. 2.5).

2.4.2 Wind Profiling Radars

Wind profiling radar (also called wind profiler) [61, 98] is a type of Doppler radar that functions in the VHF frequency band from 30 to 300 MHz and UHF frequency band 300–1000 MHz frequency bands. It operates by directing the beam energy to the normal offset by few degrees. The wind profiling radar differs from the scanning Doppler in their processing and production of Doppler [97]. In the profiler, hundreds of low intensity pulses are transmitted to create Doppler velocity spectrum with a 30 s of dwell time. Whereas, in Doppler scanning radar resolved volume moments are produced by a limited number of pulses are transmitted with dwell time of few milliseconds.

2.4.2.1 Types of Wind Profiling Radars

Different types of wind profiling radars are explained below [147]:

- 404 MHz NOAA profiler network (NPN) Profiler is used for the deepest atmospheric coverage. It uses coaxial-collinear phased array antenna with antenna
diameter of 13 m and beamwidth of 4°. It can cover a height of up to 16,000 m with vertical resolution of 900 m. With peak transmit power of 6000 W, it can attain temporal resolution of 60 min. Due to its sophisticated hardware, it is considered expensive to fabricate and operate.

- 915-MHz boundary layer profiler is easy to build and operate yet it has limited height measurement capability beyond the boundary layer. It uses flat rectangular microstrip patch antenna with antenna diameter of 2 m and beamwidth of 10°. It can cover a height of up to 4000 m only with vertical resolution of 106 m. With peak transmit power of 500 W, it can attain temporal resolution of 60 min.

- 915-MHz quarter scale profilers are also easy to build and its height measurement capability is better than the boundary layer profiler. It uses coaxial-collinear phased array antenna with antenna diameter of 6 m and beamwidth of 10°. It can cover a height of up to 8000 m only with vertical resolution of 212 m. With peak transmit power of 2000 W, it can attain temporal resolution of 60 min.

The wind profiling radars can operate in two different modes: the Doppler beam swinging (DBS) and radio-acoustic sounding system (RASS) modes. Both modes are not supported simultaneously.

- In Doppler beam swinging (DBS) the beam is steered in three to five different radial directions for Doppler spectra measurements. Accordingly, the motion
of the horizontal winds radial component is measured for each direction to
determine the horizontal wind profile. The longer time duration high mode pulse
and shorter duration low mode pulses are employed for low and high height
resolution, respectively.
• In Radio-acoustic sounding system (RASS) mode acoustics wave and radio
waves are employed simultaneously to determine. The velocity of sound wave is
analyzed as function of height to determine vertical air motion and temperature.

2.4.2.2 Sonic Detection and Ranging (SODAR)

The sonic detection and ranging (SODAR) is a type of wind profiling radar that is
used for meteorological purposes [26, 97, 99]. The sound waves are impacted by
turbulence when propagating in the atmosphere. SODAR measures that scattering
process to determine the above-ground wind speed at different heights. It is also
used to analyze the thermodynamic structure of the low atmospheric region. It is
based on the Doppler effect mechanism of the frequency change of sound waves
relative to the moving target. It operates in the 4.5 KHz sound wave spectrum.
Three different acoustic beams are transmitted. A vertical beam which goes straight
upwards and two beams are emitted at 17° normal to the Earth. The reflected signal
is received and fast Fourier transform (FFT) operation is performed for frequency
domain analysis. Accordingly, the Doppler-shifted frequency is used to determine
the wind speed. It works for the height range of up to 200 m.

In bi-static SODARs the sender and receiver can be located at a distance (usually
up to 10 m) instead of being housed in the same unit. In conventional setting,
SODARs are only able to get measurements from a fixed height. With electronically
scanned array of acoustics microphones, the receiver can get multiple views from
different heights with accurate measurements of velocity variations in turbulence.

2.4.2.3 Wind Profiling LiDARs

LiDAR (light detection and ranging) is used to illuminate the target by using laser
light and sensing the reflectance by using light sensors [114, 123]. A 3-D results
can be produced by using the delay in laser arrival time and wavelengths. A wind
profiling also works on the Doppler effects principal where the back-scattering of
light particles from the atmosphere is used to measure the wind turbulence and
speed at different heights. The performance can be further improved by using laser
beam steering mechanism where interference form the undesired components can
be reduced or totally eliminated to produce high quality results.
2.4.3 Microwave Radiometers

At larger wavelengths in the spectrum, the microwave measurements of the electromagnetic (EM) radiation are used for wavelengths between 1 mm and 1 m [15]. Microwave measurements are classified into the longwave and shortwave measurements. These are explained in the following:

2.4.3.1 Longwave Measurements

The longwave measurements are done using wavelengths that are longer than approximately 4.0 µm. These are further classified into three types:

**Longwave Broadband** The longwave broadband measurements are used for direct radiant energy diffusing in vertical upward and downward direction within the broadband and infrared wavelengths [51].

**Longwave Spectral** The longwave spectral measurements are employed for radiant energy resolving in spectrum at infrared wavelengths.

**Longwave Narrowband** It includes radiant energy measurements in the narrowband infrared wavelengths.

2.4.3.2 Shortwave Measurements

The shortwave measurements are done using wavelengths that are less than 4.0 µm. These are further classified into three types:

**Shortwave Broadband** The shortwave broadband microwave is used to measure the intensity of the radiant flux in the visible spectrum and infrared-approaching spectrum chunks of the shortwave broad-wavelength bands.

**Shortwave Narrowband** The shortwave narrowband is employed to measure the intensity of the radiant flux in the visible and infrared-approaching spectrum chunks in shortwave narrow-wavelength bands.

**Shortwave Spectral** The shortwave spectral measurements of radiant energy flux intensity are done at spectrum resolving visible and infrared-approaching wavelengths.

Radiometers are receivers of the frail EM energy which is transmitted from the surface of the earth, whereas the radars transmit their own EM pulses to the surface [15, 96]. The radiometric measurements are done using different methods such as active radar, active LiDAR, passive broadband radiometers, and passive sensors [127]. The measurements are important source atmospheric data which is obtained by measuring the decay of the energy of the electromagnetic waves when traveling through the atmosphere.
2.4.4 Ceilometer

A ceilometer is an aerosol concentration measurement device that operates on the light sources such by using laser to obtain the cloud heights and base [27]. It is considered as a type of the LiDAR with much less range. There are two different types of the ceilometers.

2.4.4.1 Optical-Drum Ceilometer

An optical-drum ceilometer consists of a detector, recorder, and moving projector and works on the triangulation technique to get the height of the cloud based light spot projection.

2.4.4.2 Laser Ceilometer

A laser ceilometer carries both the laser transmitter and receiver in the same unit and has the capability to transmit very short pulses of few nanoseconds duration to the atmosphere. These work on the same principles as the LiDAR and can be used to map atmospheric volcanic ashes and clouds.

2.4.5 Microbarographs

The microbarograph, also named as barograph, is used to measure pressure of the atmosphere in millibars with reference to sea levels. A graph paper, wrapped around the moving cylindrical bar, is used for recording the continuous pressure [64].

2.4.6 Pyranometer

A pyranometer is a device to determine flux density of solar radiation in hemisphere. It measures solar irradiance by surfaces of planar shapes [107]. Pyranometer is a special type of actinometer with wavelength range of 0.285 to 2.8 μm. It is used for measuring solar irradiance on a planar surface and it is designed to measure the solar radiation flux density from the hemisphere above within a wavelength range of 300–3000 nm. The sun emits solar radiation, which can be harvested for heat and electric energy uses. Many environmental indexes are produced from the data acquired from the pyranometer such as temperature, humidity, sun, and wind (THSW) and ET. Aerosol characteristics (e.g., scattering, phase, refraction index) can be produced through photometer sky radiance measurements inversion. Sun
photometer instrument is used to measure radiance at four frequencies in various scanning scenarios. The aerosol optical depth (AOD) is also measured using this instrument.

### 2.4.7 Millimeter Cloud Radar

The millimeter cloud radar (MMCR) works on the measurement of vertical speed of the particles also called the Doppler velocity [3, 28]. When clouds are above the radar, the MMCR measures its vertical profile by using the reflectivity which is a measure of the intensity of the returning signal. Accordingly, the size of the cloud particle is determined by using colors. A rising particle is indicated by a warm color and fall particles are specified by cool colors. Similarly, the width of spectrum shows the diversity of the cloud particles (the typical particle size is approximately 0.2µm.)

### 2.4.8 Sonic Anemometers

An anemometer is an instrument commonly found on meteorological stations. It is used for rapid 3-dimensional wind speed measurements with higher accuracy. It is also used for turbulence measurements [66]. It supports sub-meter (0.01 m/s resolution) in 6000 cm range with rates of 0.1 KHz which is helpful for detailed turbulence analysis. Sonic anemometers operate by measuring the time taken for a pulse of sound to travel between a pair of acoustic radios (both radios are equipped with transmission and reception facility, which is alternated for bi-directional measurements). Since, the velocity of the sound wave is affected by many factors (e.g., fog, dust, temperature, and pressure), accurate measurement requires sensitive anemometer equipment. Moreover, the heavy downpour also affects the measurements and leads to variations in pulse travel time. Similar type of errors is also observed in icy conditions requiring anti-ice warming equipment to be integrated with the equipment. To reduce the effects of the distortions caused by the air flow, calibrations are performed in wind tunnels to correct direction related errors. The wind angle and direction can be measured by employing more than two radios. It supports operation in 0.02, 0.05, and 0.1 kHz frequency bands.

### 2.4.9 Environmental and Meteorological Satellites for Remote Sensing

Meteorological satellite plays a vital role in climate change and variability analysis. These are used to obtain the meteorological, oceanographic, and terrestrial data
The meteorological and environmental satellites are used for different types of EM waves measurements that are either emitted or reflected from the Earth such as ocean and land surface and from the atmosphere [18, 39, 67, 71]. These satellites have the capability to measure the wide range of EM spectrum including the visible light spectrum, radiations in microwave and infrared bands [61, 76]. These are explained in the following sections.

### 2.4.9.1 Geostationary Satellites

The geostationary satellites functions in orbits and these spin in the direction of Earth rotation [164]. Therefore, with reference to the surface of the Earth, a static position is maintained over the Earth at very high altitude (23,922 miles). Due to this factor, these satellites have the capability to observe the same region of the Earth and are frequently used in weather applications such as cloud properties sensing. However, in comparison to the low altitude satellites, high resolution analysis cannot be supported. These satellites provide consistent data flow to ground stations about the planet after every half hour. Two main instruments on the GOES satellite are an imaging and sounding system. The imaging instrument supports are capable of taking measurements at four different frequencies in visible, water vapor infrared and thermal infrared spectrum for cloud water, and surface temperature monitoring. The Geostationary Operational Environmental Satellite (GOES) East and West are the two examples of the geostationary satellites:

- The Geostationary Operational Environmental Satellite East is also known as GOES-12. It is located 75° west longitude over the equator at 7. It is used to cover the American continent.
- The Geostationary Operational Environmental Satellite West satellite, positioned over 135° west longitude, this is also called GOES-10. The eastern pacific region is covered by these satellites. Similar satellites are also being operated to cover the provide coverage at global scale
- The Geosynchronous Meteorological Satellite (GMS) is also known as GMS-5. It is used to cover the western pacific region. It is located over the equator at 140° east longitude. With the exception equipment of sounding hardware, all equipment found on the GOES-West and GOES-East satellites are also present on the GMS with same imaging capabilities.

### 2.4.9.2 Polar-Orbiting Satellites

The polar orbiting satellites generally are in comparatively low altitudes circular orbits in comparison to the geostationary satellites. The typical height is approximately 435–500 miles and it takes 1.6 h to complete the orbit. Moreover, as compared to geostationary satellites, their position is not fixed rather these
continuously change their position with relative to the surface of the Earth. These can provide high resolution imaging but complete coverage of the Earth takes many days by using multiple satellites.

Examples of the polar-orbiting satellites are given below:

- The Defense Meteorological Satellite Program (DMSP). These are used to provide meteorological coverage on diurnal basis about the oceanographic, meteorological, and terrestrial properties of the planet. DMSP satellites orbit at an altitude of approximately 830 km, collecting images across a 3000-km swath under both daytime and nighttime conditions. Each satellite views any point on the Earth twice a day and completes an orbit in about 101 min. Complete global coverage is provided every 6 h. The measurement instrument on DMSP satellites includes the Special Sensor Microwave Imager (SSM/I) [47, 69, 133, 163] for geophysical parameters, the SSM/T, and the SSM/T2 (atmospheric sounding instruments for microwave temperatures at different heights). These are used to gather data at four different frequencies using two polarization settings. The geophysical data provided by SSM/I consists of wind speed and temperature at ocean surface, land and water precipitation, and atmospheric water vapor.
- The NOAA Polar-orbiting Operational Environmental Satellites (POES) provide daily coverage
- Landsat satellites. Supports higher resolution and multi-spectral imaging
- French SPOT satellites. No daily coverage capability

2.4.9.3 More Meteorological Satellites

More weather imaging and atmospheric monitoring satellites are also used globally such as European Community operates Meteosat, China operates the Feng-Yun, Russia operates GOMS, and INSAT satellite is operated by India. Features of these satellites are explained in the following:

- Meteosat is a type of geostationary satellite. It is operated by the European Organization for the Exploitation of Meteorological Satellites (EUMETSAT). Meteosat is used to obtain data using visible light, thermal infrared, and water vapor infrared wavelengths.
- Feng-Yun is operated by also a geostationary meteorological satellite. It is located at 105° east longitude. It is equipped with visible wavelength sensor system that senses radiation in one visible frequency and two infrared frequencies. This equipment has the capability of producing visible imaging of the Earth on a particular day.
- GOMS has the infrared equipment and is also Elektro and GOMS-1. It works on the geosynchronous weather imaging technology.
- The Indian INSAT satellite is located above the equator at approximately 90° east longitude. It is used to obtain images of Central Asia and Indian Ocean.
2.4.10 **GPS Signals for Remote Sensing**

A remote sensing tool has been proposed which uses signals from GPS satellite systems for sensing applications where GPS reflectivity data is utilized for weather forecast [14, 172]. GPS consists of 28 satellites which orbit approximately at an altitude of 12427 miles. Two different methods are discussed below:

2.4.10.1 **GPS Limb Sounding for Atmospheric Reflectivity**

In GPS, the position of the receiver is determined by the signal travel time from the satellite to receiver [87]. GPS signal reaches at the receiver through multiple paths which are reflected from the surrounding objects and surfaces. These multipath signals can cause destructive or constructive interference depending on the location of the object. However, this reflection is being utilized to obtain useful information about the sea ice, ocean state, soil moisture, snow pack, and sea ice. The GPS transmitted EM signal wave length is approximately 0.2 m. The reflections from these environmental parameters are investigated and novel GPS limb sounding techniques have been developed which are also called the occultation method. This technique produces accurate profiles of reflectivity in atmosphere.

2.4.10.2 **GPS for Precipitable Water**

GPS signals are also used to monitor the amount of precipitable water which is the entire water vapor in the atmosphere between two points in a column [14]. Due to complex permittivity of the water vapor, it absorbs and delays the EM waves traveling through the atmosphere. This can be measured by using interferometric instrument and is mapped to water vapor content. Another device sun photometer is also used to measure precipitable water by measuring the collimated solar radiation and the columnar aerosol optical depth (AOD).

2.5 **Climate IoT Monitoring Systems**

2.5.1 **Cloud Properties Monitoring**

The sensing of the vertical and horizontal distribution of macroscopic properties of clouds is done using active and passive remote sensing equipment [46, 145, 161]. The ceilometer is used to produce the vertical backscatter profile for cloud base height measurements. The Cloud, Aerosol Polarization and Backscatter LiDAR (CAPABL) is another type of cloud properties measurement tool. The microphysical cloud properties (e.g., shapes, sizes, water, and ice phases of the cloud particles) are also determined.
Microphysical Properties of Clouds The cloud properties sensing also involves microphysical measurements of thorough physical dimensions of the hydrometeor (an atmospheric phenomena related to clouds that involves water, water vapor, rain and other time varying characteristics of the clouds) [27, 29, 56, 88]. These measured hydrometeor characteristics are related to its phase, water and ice content, size, optics, and radar recurring properties.

Macrophysical Properties of Clouds The macrophysical properties of clouds involve measurements of cloud level parameters of clouds, that includes their place and position, dimensions, location, type, and the path of water and ice [28, 84, 85].

The cloud profiling instrument (profiler) operates in three different wavelengths. These include 915 MHz ultra-high frequency band, 2.835 GHz microwave band, and 50 MHz very high frequency. The radar sends energy and receives the back-scattered waves. Two types of turbulence phenomena are observed in these bands: Bragg scattering from reflectivity and Rayleigh scattering from hard objects. In these spectrum bands, the moisture and temperature are the primary sources of Bragg scattering, whereas the organic objects and hydrometers are the main cause of Rayleigh scattering. These instruments are used to observe atmospheric hydrometers.

2.5.2 Atmospheric Emissions Monitoring

The emission’s scenarios [108] including different radiatively actives substances such as greenhouse gases and aerosols are monitored using LiDARs and other equipment which measures optical and scattering properties, size distribution, and aerosols extinction. This includes atmospheric monitoring for vertical and horizontal moisture, thermal, and kinetic properties and concentration of CO$_2$ and O$_3$ gases (e.g., radiatively active traces) using air-borne and surface based instruments.

2.5.3 Monitoring of the Surface of the Earth

The monitoring of the surface of the Earth involves measurements taken on, alongside, and underneath (less than two meters in the subsurface) the earth’s earth-air interface. These observations ascertain characteristics such as soil’s temperature and soil’s volumetric water content, reflectivity of earth surface, momentum flux, latent and sensible heat, moisture, and CO$_2$ [34, 72, 100]. The numerical weather prediction models use these observations of earth surface, above ground and underground temperature, soil moisture, temperature of the radiative Earth skin, and surface reflectivity to provide current and foretasted values of these phenomena.
**Surface Meteorology**  The land-based observations close to the Earth-air interface including precipitation, air temperature and pressure, moist content, and wind speed and direction are done using surface meteorology [70, 73].

**Upper Air State**  Another important element of earth monitoring is the upper air state. The measurement techniques include balloon-borne, areal, and satellite-based observations. Many important parameters of the atmospheric profiles include geopotential height, wind, moisture, temperature, and air pressure to support weather prediction models by providing input of these vital parameters.

### 2.5.4 Sea State Monitoring

The accurate information about the sea state is vital for weather forecasting and marine traffic [17]. The knowledge of sea state along with heat and moisture fluxes at multiple provide useful information at multiple scales. The sea state monitoring is the one using radars and drones. Other important sea state monitoring parameters include status of Arctic changes such as sea ice melting process, decline in sea-ice extent and thickness, wind and ocean circulation in North Atlantic. These are discussed in the next section.

#### 2.5.4.1 OceanSITES

The OceanSITES is a network of global measurement stations for ocean to sea-floor and air-sea interaction monitoring [140]. It measures the surface and water column automated using sensors. The observations made using OceanSITES includes water transport, ocean acidification, meteorology, bio-geo-chemistry, carbon cycle, physical oceanography, and geophysics.

#### 2.5.4.2 Air-Sea Heat Fluxes

In Atlantic observing system, the transport mooring arrays (TMAs) are employed in Atlantic Ocean to acquire long-term data of heat, volume, and freshwater fluxes of significantly strong flows. The air-sea heat-flux calculation is important for wave dynamics, kinematic and thermodynamic sensitivity analysis [171].

### 2.5.5 Arctic Measurements

The increasing temperatures have caused the rapid warming of the Arctic at a large scale due to which its sea cover has reduced. It has also induced the variation in heat
reflection and absorption from the ocean. The sunlight scattering, transmission, and absorption mechanisms of ice, snow, and water are different. Arctic measurements will play a vital role to get insights into the changing global weather patterns [24, 31, 53, 57, 85, 86, 115, 125, 148, 152, 156, 161, 169].

### 2.5.6 Hurricane Monitoring

To predict hurricane path and its intensity [103], reliable weather models are necessary. However, many physical model components that play a critical hurricanes are not understood very well and more measurements needed. In this regard, the identification and parameterization of heat fluxes and momentum over sea-air interface are required. The extension of similar analysis to the spray-filled transition layer is also needed for better accurate path prediction. The climate IoT with it capabilities of atmospheric observations and empirical measurement sin lab settings, coupled with models these parameterizations of sea-air momentum, and the heat flux can be better understood hurricane conditions. Different hurricane models are:

- The Global Forecast System (GFS)
- United Kingdom Meteorology (UKMET)
- Hurricane Weather Forecast Model (HWRF)
- Geophysical Fluid Dynamics Laboratory (GFDL)
- The European Medium Range Forecast Model (ECMWF)
- Navy Operational Global Prediction System (NOGAPS)

### 2.5.7 Solar Radiation Monitoring

Solar Radiation Network (SolRad-Net) is a network of sensors to provide high frequency solar flux measurements [135]. The Aerosol Robotic Network (AERONET) is network of distributed dynamic sun photometers to enable different ocean related applications [50]. The aerosol optical depth is done using the maritime aerosol network (MAN) element of AERONET. These measurements can be used to validate satellite, ground, and other aerosol based measurements.

A list of field testbeds with functionality and sensing capabilities for climate IoT integration is shown in Table 2.1.

### 2.6 Climate Databases Integration to IoT and Cloud

Climate IoT is envisioned as paradigm to manage and leverage the data from sensors and monitoring systems. Through cloud integration, it can handle complex data sets of high volume to support decision support systems designed to address complex
<table>
<thead>
<tr>
<th>Testbed</th>
<th>Description</th>
</tr>
</thead>
<tbody>
<tr>
<td>Arctic clouds in summer experiment</td>
<td>Observation of ice and sea conditions, clouds, atmospheric composition, and energy budget of earth surface</td>
</tr>
<tr>
<td>Boulder atmospheric observatory</td>
<td>Boundary layer analysis and long-term climate baseline measurements using is a 300 m meteorological tower for instruments</td>
</tr>
<tr>
<td>California nexus</td>
<td>Air quality and climate change airborne measurements using aircraft and surface measurements using mobile platform as well as fixed ground stations</td>
</tr>
<tr>
<td>CalWater</td>
<td>Analysis of atmospheric rivers and aerosols in clouds and precipitation using areal, ground, and sea-based measurements</td>
</tr>
<tr>
<td>Colorado airborne multi-phase study</td>
<td>Clouds and precipitation investigations</td>
</tr>
<tr>
<td>Coordinated observations of the lower arctic atmosphere</td>
<td>Low atmosphere thermodynamics analysis</td>
</tr>
<tr>
<td>Denver-Julesburg basin air quality study</td>
<td>Analysis of hydro-carbon emissions from gas and oil to observe methane</td>
</tr>
<tr>
<td>Dynamics of the Madden–Julian oscillation</td>
<td>Flux, sonde, and W-band radar measurements for MJO analysis</td>
</tr>
<tr>
<td>Front range air pollution and photochemistry testbed</td>
<td>Wind profilers/RASS and surface meteorology sensors for photochemistry, oxidant and aerosol formation and fate, flow and recirculation patterns</td>
</tr>
<tr>
<td>Discover air quality testbed</td>
<td>Air quality and pollution measurements</td>
</tr>
<tr>
<td>High wind gas exchange</td>
<td>Air-sea flux and wave observations</td>
</tr>
<tr>
<td>NOAA hydrometeorology testbed</td>
<td>High-impact regional precipitation, weather and land surface conditions analysis</td>
</tr>
<tr>
<td>Hurricane and severe storm sentinel</td>
<td>Hurricane formation and intensity change analysis in the Atlantic ocean basin</td>
</tr>
<tr>
<td>Intl arctic systems for observing the atmosphere</td>
<td>Arctic atmospheric observations of air-sea-ice flux, boundary layer dynamics, and clouds</td>
</tr>
<tr>
<td>Integrated characterization of energy, clouds, atmospheric state, and precipitation at summit</td>
<td>The clouds and precipitation analysis over the Greenland ice sheet using radar, LiDAR, precipitation, and radiosonde</td>
</tr>
<tr>
<td>Midlatitude continental convective clouds testbed</td>
<td>Cloud and precipitation analysis using radars</td>
</tr>
<tr>
<td>RV Mirai Arctic</td>
<td>Surface fluxes measurements using sonic anemometers and radiometers</td>
</tr>
<tr>
<td>Sea state</td>
<td>Wave and energy fluxes analysis during ice expansion at boundary layer</td>
</tr>
</tbody>
</table>
environmental problems. Climate IoT also provides the opportunity design novel tools for searching, sharing, analysis, and visualization of data. A list of such data sets is given in Table 2.2.

### 2.7 IoT Enabled Indices

The climate IoT enables integration of following vital indices:

#### 2.7.1 Air Quality Index (AQI)

AQI is an air quality pollution index [102]. The AQI index is determined for various air pollutants including sulfur dioxide, particle pollution, ground level ozone, and carbon monoxide. For each of these pollutants, the AirNow is used to report current and future pollution forecasts.
Table 2.2  Climate databases

<table>
<thead>
<tr>
<th>Name</th>
<th>Data set description</th>
<th>Technology used in collection</th>
</tr>
</thead>
<tbody>
<tr>
<td>International surface pressure data bank</td>
<td>The world’s largest collection of pressure observations from 1856 to 2012. The ISPDv3 is a blend of many national and international collections of station, marine, and tropical cyclone best track pressure observations</td>
<td>Miscellaneous</td>
</tr>
<tr>
<td>Arctic summer cloud ocean cloud database</td>
<td>Cloud macro and microphysical measurements</td>
<td>Ka-band cloud radar, multichannel radiometer, and ceilometer</td>
</tr>
<tr>
<td>Arctic summer cloud ocean wind profiler database</td>
<td>Wind profiles and backscatter</td>
<td>449 MHz wind profiler radar</td>
</tr>
<tr>
<td>Daily hydro-meteorological data set for Mexico, the conterminous U.S., and southern Canada: 1950–2013</td>
<td>Hydrologic states, precipitation, maximum and minimum daily temperature and fluxes</td>
<td>A 6 km gridded product station</td>
</tr>
<tr>
<td>Hydrologic rainfall analysis XMRG data set</td>
<td>Four years of the California Nevada River Forecast Center (CNRFC) precipitation and temperature data sets with the XMRG</td>
<td>Miscellaneous</td>
</tr>
<tr>
<td>Air-sea flux</td>
<td>Ship-based flux observations</td>
<td>Satellite observations</td>
</tr>
<tr>
<td>Global ensemble forecast system reforecast data set</td>
<td>A 150 TB data set of global ensemble forecasts and a wide range of experimental forecast guidance based on these, including week-2 temperature and precipitation forecasts, week +1 precipitation forecasts, weeks +1 to +2 tornado forecasts</td>
<td>Miscellaneous</td>
</tr>
<tr>
<td>Worldview</td>
<td>More than 800 global, full-resolution satellite imagery layers for ash plumes, air quality, dust, drought, fires, severe storms, floods, smoke, water and ice, settlements, vegetation, and temperature</td>
<td>Satellite</td>
</tr>
<tr>
<td>Web soil survey (WSS)</td>
<td>Source of comprehensive soil related information</td>
<td>In-situ soil moisture measurements</td>
</tr>
<tr>
<td>Wave exposure model (WEMo)</td>
<td>Wind wave energy and the movement of seafloor sediment in enclosed water bodies such as lakes, coastal bays, and estuaries</td>
<td>Miscellaneous</td>
</tr>
<tr>
<td>Multiscale integrated models of ecosystem services (MIMES)</td>
<td>Georeferenced data sets as well as knowledge of ecological, economic, and social processes</td>
<td>Miscellaneous</td>
</tr>
</tbody>
</table>
2.7.2 Drought Index (EDDI)

The Evaporative Demand Drought Index (EDDI) [109] is a drought monitoring and early warning tool. It provides early warning of developing drought and status of current droughts. The Standardized Precipitation Index (SPI) is another drought index used to monitor meteorological droughts.

2.7.3 Environmental Sensitivity Index (ESI)

The information about the coastal resources and other hazards such as oil spill, and sensitive shorelines can be obtained from ESI [52]. The ESI maps are utilized for hazard planning, to set safety priorities and practices.

2.7.4 Coastal Drought Index Using Salinity Data

Based on salinity data, a coastal salinity index (CSI) has been developed which provides monthly precipitation along with monthly mean salinity data to ascertain the probability of salinity for a specific month [129].

2.7.5 Wildfire Threat Index (SAWTI)

SAWTI is an index to forecast the fire potential by considering the wind potential. Surface temperature and relative humidity are the vital parameters for these fire-prone wind events monitoring [134].

2.8 Environmental Sensing Systems

In this section, different atmospheric sensing systems are discussed. A detailed list of these systems is given in Table 2.3.

2.8.1 Precipitation Occurrence Sensor System

The precipitation occurrence sensor system (POSS) is a type of Doppler radar that operates in X-band for precipitation sensing. It can sense type, intensity, and
<table>
<thead>
<tr>
<th>Tool</th>
<th>Description</th>
</tr>
</thead>
<tbody>
<tr>
<td>Twentieth century reanalysis</td>
<td>Global reconstruction of weather every 6 h from the surface of the earth to the tropopause back to 1851</td>
</tr>
<tr>
<td>Automated frost/heat forecast system</td>
<td>Frost and heat occurrences prediction in Vineyards</td>
</tr>
<tr>
<td>Atmos. river water vapor flux tool</td>
<td>Combines observations of wind profiles and integrated water vapor (IWV) to measure the IWV flux in the controlling layer and compares to operational numerical weather prediction prior and future forecasts</td>
</tr>
<tr>
<td>Atmospheric river detection tool</td>
<td>Automated objective software package to aid in the identification and characterization of atmospheric rivers to assist forecasters</td>
</tr>
<tr>
<td>Fairall–Banner sea-spray flux algorithm</td>
<td>A set of computer codes that allow estimation of air-sea momentum, heat, and moisture fluxes at hurricane wind speeds. Accounts for the effects of sea spray</td>
</tr>
<tr>
<td>Forecast reference evapotranspiration (FRET)</td>
<td>Bias-correction of FRET</td>
</tr>
<tr>
<td>Hydrologic model performance assessment tool</td>
<td>Set of R codes for calculating the performance metrics of hydrologic modeling. The developed metrics include Nash–Sutcliffe efficiency, runoff volume difference, modified correlation coefficient, percent bias, and time to peak. These functions can also automatically detect the miss of the USGS streamflow data to ensure the model assessment being executed on the apple-to-apple basis</td>
</tr>
<tr>
<td>Integrated characterization of energy, clouds, atmospheric state, and precipitation</td>
<td>Web page hosting near-real time measurements and data products from a suite of ground-based remote and in situ sensors characterizing the atmosphere, clouds, and precipitation at summit station on top of the Greenland ice sheet</td>
</tr>
<tr>
<td>MRMS NetCDF-XMRG format transformation tool</td>
<td>A set of Python codes which can transform the 1-km resolution multi-radar multi-sensor (MRMS) QPEs between the NetCDF and XMRG format. The tool also possesses the capabilities to perform the geo-reference and aggregation functions.</td>
</tr>
<tr>
<td>NOAA COARE bulk flux algorithm</td>
<td>A set of computer codes that allow estimation of air-sea or air-ice fluxes using bulk meteorological inputs. Meteorological and numerous trace gas fluxes are available</td>
</tr>
<tr>
<td>Snow-level product</td>
<td>A patented method to detect the level of the atmosphere where snow changes into rain</td>
</tr>
</tbody>
</table>

(continued)
### Table 2.3 (continued)

<table>
<thead>
<tr>
<th>Tool</th>
<th>Description</th>
</tr>
</thead>
<tbody>
<tr>
<td>Vertical profile tool</td>
<td>Website allows users to extract different atmospheric products showing the vertical profile of the atmosphere. The products include single or multiple profiles on a date, a vertical transect between 2 points, a skew-T plot and a time by height plot. Data is extracted from different reanalyses and starts in 1871.</td>
</tr>
<tr>
<td>Vertically integrated water vapor transport (IVT) GIS tool</td>
<td>A python-based function which can automatically calculate water vapor transport at each pressure level and take integral of them. The domain covers the Pacific Ocean, Western US, and Southern Alaska. The tool is suitable for calculating IVTs for the variables extracted from the MERRA and NARR data sets.</td>
</tr>
<tr>
<td>WRIT: web-based reanalysis intercomparison tools</td>
<td>A set of web tools for plotting maps and time series that allows users to compare reanalysis and observed data sets.</td>
</tr>
<tr>
<td>Climate registry for the assessment of vulnerability</td>
<td>Assessments of the vulnerability of various natural and human resources to a changing climate</td>
</tr>
<tr>
<td>Climate resilience toolkit</td>
<td>Enable decision-makers to take action to boost their climate resilience using data-driven tools, information, and subject-matter expertise to make smarter decisions</td>
</tr>
<tr>
<td>Planning framework for a climate-resilient economy</td>
<td>Help communities recognize their economic vulnerabilities</td>
</tr>
<tr>
<td>Smart growth fixes for climate adaptation and resilience</td>
<td>Codes and policies for climate change</td>
</tr>
</tbody>
</table>

The occurrence of precipitation and provides measurements of liquid precipitation and solid precipitation [122].

### 2.8.2 Radiosonde Temperature and Humidity Sensing

A radiosonde contains atmospheric sensing instrument (e.g., radiometers) installed on a weather balloon to measures different atmospheric parameters and transmission to ground stations. These are generally launched in open seas and ocean for temperature and humidity measurements and provides resolution of up to 10 km depending on the balloon flight altitude and capabilities of sensing instrument [21].
2.8.3 **Cloud, Aerosol Polarization and Backscatter LiDAR (CAPABL)**

The CAPBL is a tool to measure depolarization, particle orientation, and the backscatter of clouds and aerosols [145].

2.8.4 **Operational Bright-Band Snow Level Sensing**

A Doppler-effect based atmospheric profiling radar is employed to sense bright band snow levels (the heights in atmosphere at which snow becomes rain) from the atmospheric reflectivity and vertical Doppler velocity [162]. Another type, FM-CW snow level radar, uses advanced low transmit power frequency modulation of continuous waveform technique, which only uses less than a watt of transmitted power. It operates in 2835 MHz frequency band which is useful for precipitation properties measurements due to very weak attenuation/absorption of radio waves by moisture in this frequency spectrum.

2.8.5 **Atmosphere Tomography Using Acoustic**

In acoustic, travel time of sound waves is measured using array of horizontally located (up to 100 m high) acoustic tomography transmitters and receivers for temperature and wind velocity analysis [168].

2.8.6 **Automated Atmospheric River Detection**

Atmospheric river (AR) consists of narrow quills of high water vapor transport that leads to flooding [89, 105, 113, 132, 165, 166]. The identification and characterization of atmospheric river events are done using satellite and CALJET aircraft observations in the areas of integrated water vapor and transport (IWV and IVI) [130, 131, 141, 165]. It is based on integrated water vapor thresholds (e.g., width, length, core IWV contents of different features). A comparison of different detection criterion is given in [165]. A list of environmental monitoring systems is given in Table 2.3.
2.9  Case Studies

2.9.1  Indian Ocean Tsunami Warning System

In Indian Ocean tsunami warning system water and wave flow is measured using the whereby kinetic sensors [60]. These sensors are deployed in the ocean bed. These sensors can transmit data from the ocean floor which can be received by disk buoys afloat. The tsunami warnings are issued using these warning systems. The sensors communicate to buoys using acoustic technology for sea floor to surface communications and then use satellite links to warning systems.

2.9.2  Undersea Cables as Seismic Sensors

In an ITU project, sensors are deployed submarine cables to detect earthquakes and seismic events. Moreover, the fiber optic cables, on the ocean floor can also be used as seismic sensors can predict tsunamis, and provide insights into global seismic activity without any disruption to the service [54].

2.9.3  Connected Alarm Systems for Fast Moving Fires

Due to close proximity of home fires can spread quickly in urban slums. A red cross project in high density urban slums is using low cost, low energy, solar power sensors sense and alert authorities about the emerging fast moving fires, its location, and threat. It is deployed in Nairobi and Cape Town [153].

2.9.4  Urban Air Quality Sensing

Air quality sensors are employed to sense air in fresh air in Benin urban areas to track quantity and variations of pollutants. These sensors can sense and sense data with duty cycling period of 20 min using 3G wireless technology [5].

2.9.5  Water Flow Sensors

To monitor hydrological data about river levels and flows, water flow sensors are being used in developing countries. These sonar range water stream sensors can determine the distance to water surface [1].
References


References


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