

# Plume Tracker: Interactive Mapping of Atmospheric Plumes via GPU-based Volumetric Ray Casting

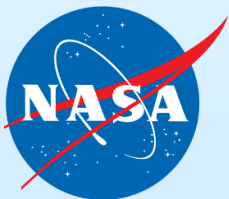


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**Earth  
Science  
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***2012 HyspIRI Science Workshop  
Washington, DC  
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# Presentation Outline

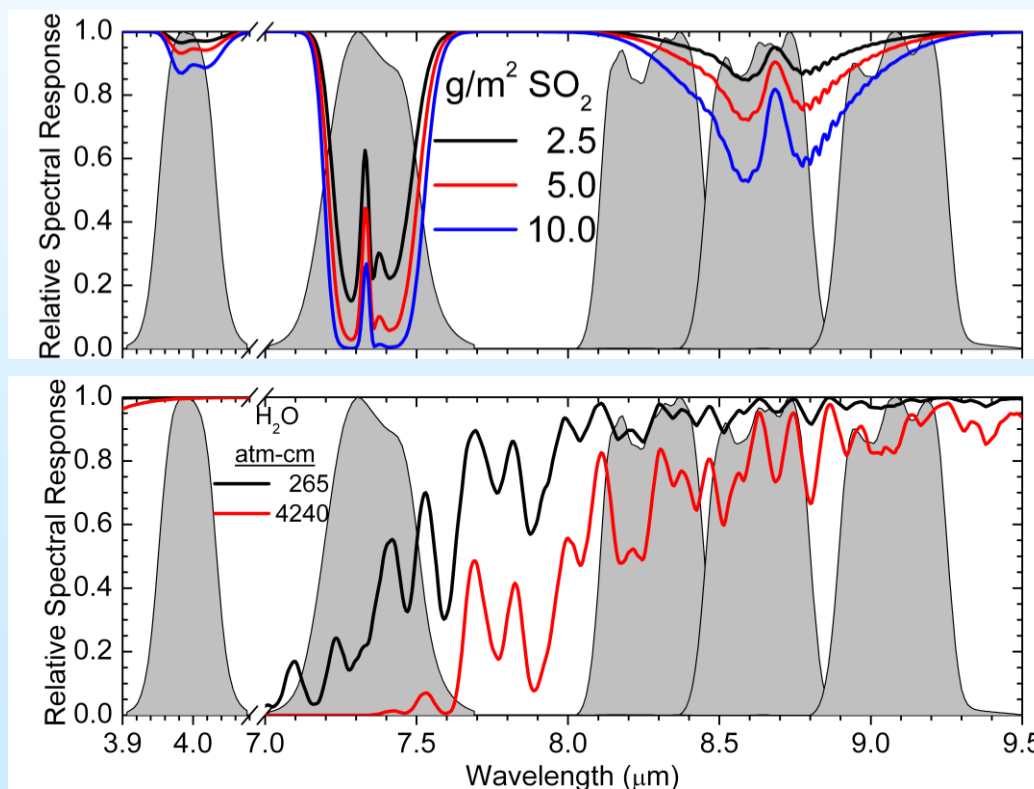
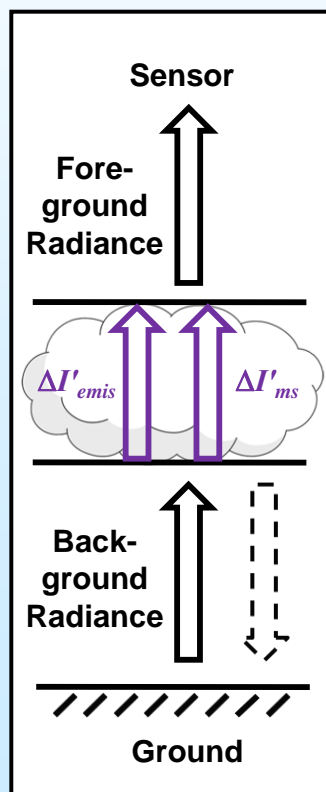
- Background and Problem
- Program Objectives and Approach
  - Plume Tracker / MODTRAN<sup>®</sup> Overview
- Upgrading Plume Tracker with Current MODTRAN
- MODTRAN Profiling and GPU Strategy
- Summary

**MODTRAN computer software is a registered trademark owned by the United States Government as represented by the Secretary of the Air Force.**



# Background: 2010 HypIRI Workshop Presentation

- Described a new capability to model local chemical plumes within the MODTRAN atmospheric radiative transfer model
- Discussed applications to Volcanic SO<sub>2</sub>
- Led to an ESTO Advanced Information Systems Technology Effort





# The Problem

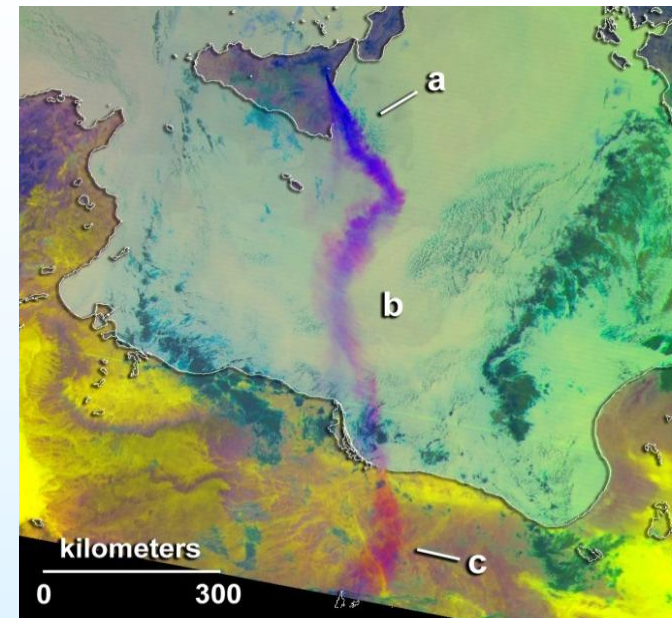
- Timely quantification of volcanic releases is important for
  - Signaling an **impending eruption** via SO<sub>2</sub> monitoring,
  - Assessing impact on **climate forcing** from volcanic aerosols, and
  - Insuring safe and efficient commercial **aviation** in the presence of ash clouds.
- The JPL Plume Tracker (formerly MAP\_SO2) toolkit accurately characterizes volcanic effluents from satellite-based Thermal Infrared (TIR) spectral imagery data
- The bottleneck in Plume Tracker processing is the computationally intensive but radiometrically accurate MODTRAN calculations
  - Plume Tracker uses an old version of MODTRAN (Mod3.5, circa 1997)
  - The current version of MODTRAN (Mod5.3) is more accurate, but slower!
    - Correlated-*k* algorithm added to improve accuracy of scattering calculations
    - A 0.1 cm<sup>-1</sup> spectral resolution added for narrow band spectrometers
    - First-principles Voigt spectral-bin transmittance required for 0.1 cm<sup>-1</sup> option
    - Upgrade from 2 to 4 parameter band model for 9.6 μm O<sub>3</sub> band
    - Local Chemical Plume capability



# Program Objectives

## 3 Year Effort – 01 April 2012 Start Date

- Timely quantification of volcanic releases from analysis of satellite-based TIR spectral imagery data
- Develop a GPU implementation of MODTRAN's TIR radiance algorithms
- Integrate the MODTRAN accelerated modules into Plume Tracker for retrieving and mapping the 3-D composition of atmospheric plumes using JPL established retrieval algorithms
- Performance goals are 100-fold speed up of radiative transfer calculations vs. JPL's current model
- Plume Tracker will permit near real-time visualization of the impact of changes in model parameters for scenes like the MODIS-Aqua image of the Mt. Etna Eruption Plume



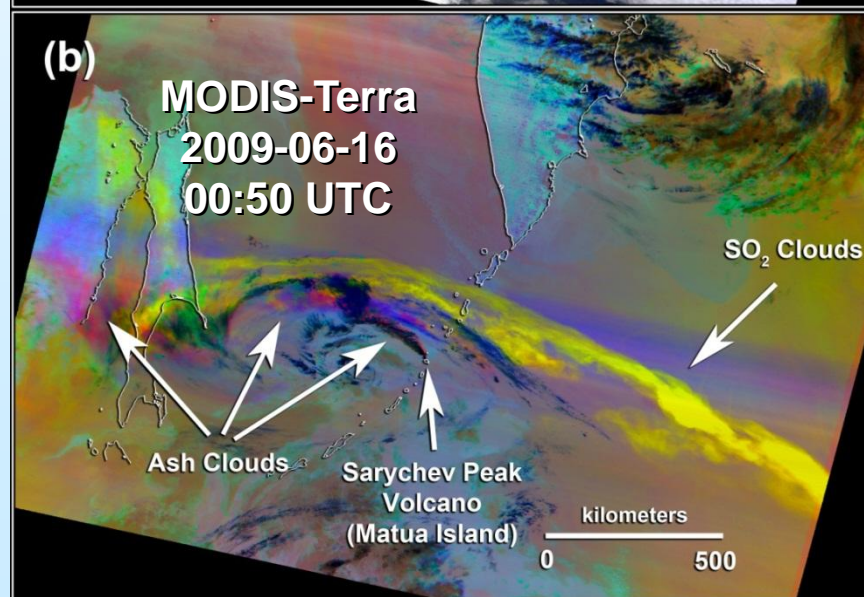
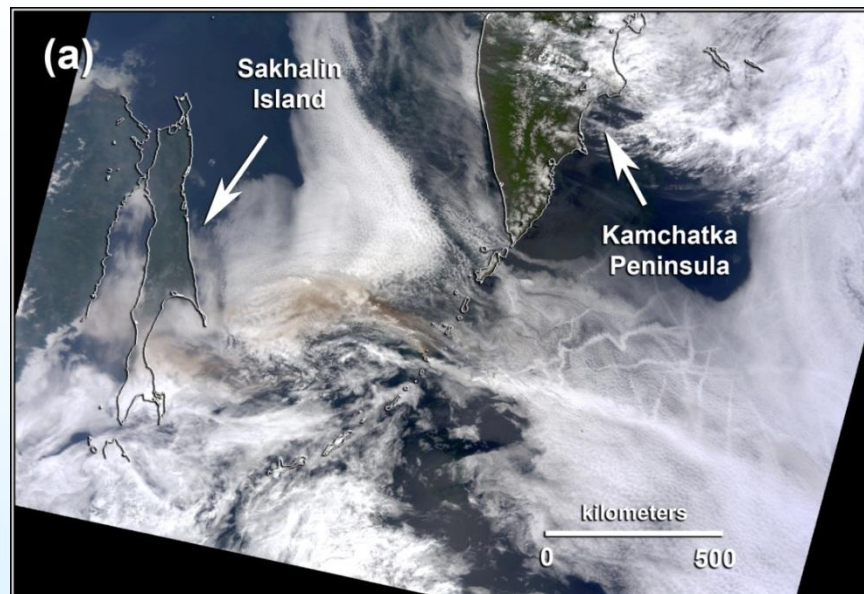


# Plume Tracker: Interactive Mapping of Volcanic Emissions with Radiative Transfer Modeling



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- Analysis of Data from Multiple Instruments, with Ancillary Data from Multiple Sources
- Graphic User Interface
  - Import Image and Ancillary Data
  - Specify Parameters for RT Modeling
  - Visualize Input Data & Retrieval Results
- MODTRAN3.5 serves as the Radiative Transfer Model Workhorse
  - Optimized for TIR Modeling
  - Hash Table Minimizes Calculations
  - Portable Component Architecture
- Retrieval Procedures
  - Surface Temperature and Emissivity
  - Total Column  $\text{SO}_2$ ,  $\text{H}_2\text{O}$  Vapor, and  $\text{O}_3$
  - Optimized for 2-Component Retrievals



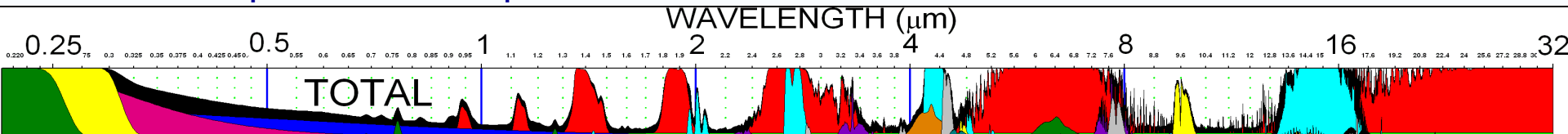


# MODTRAN5 Overview

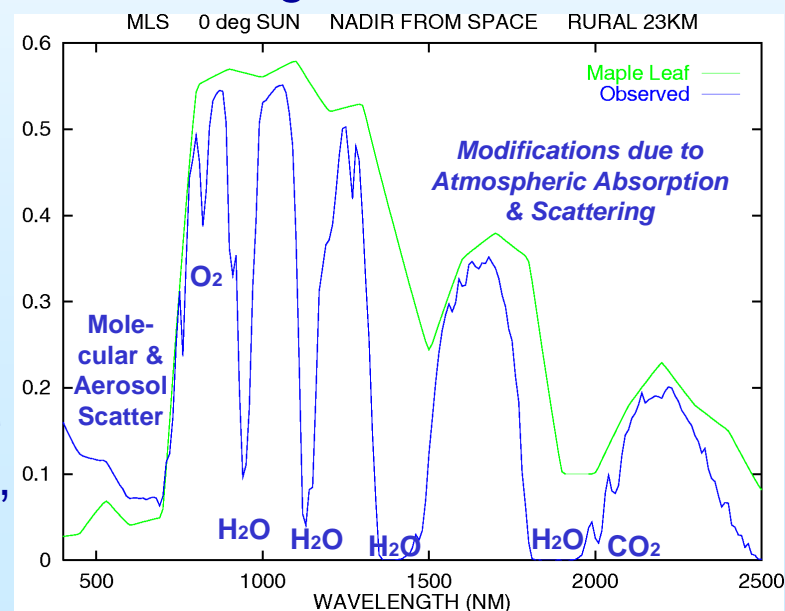
Now **Free to US Govt and their Contractors**



- IR / Vis / UV Transmittances, Radiances and Fluxes
  - Up to  $0.2 \text{ cm}^{-1}$  Spectral Resolution from  $0.1 \text{ cm}^{-1}$  Band Model



- Stratified Molecular / Aerosol / Cloud Atmosphere
  - Built-in, Auxiliary & User-Specified Molecules and Particulates
- 2-Stream and DISORT Solar and Thermal Scattering
  - Diffuse Transmittance and Spherical Albedo for Atmosphere Correction →
- Spherical Refractive Geometry
- Spectral Convolution & Filtering
- Many Applications Pertinent to HypsIRI
  - Atmospheric Correction/Retrieval, Scene Simulation, Measurement/Data Analyses, Sensor Design, Algorithm Development, Localized chemical clouds modeling, ...





# Approach



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1. Design architecture for GPU implementation of MODTRAN TIR radiance

2. Update Plume Tracker GUI for interfacing Mod53 with GPU software

3. Streamline MODTRAN TIR emission algorithm

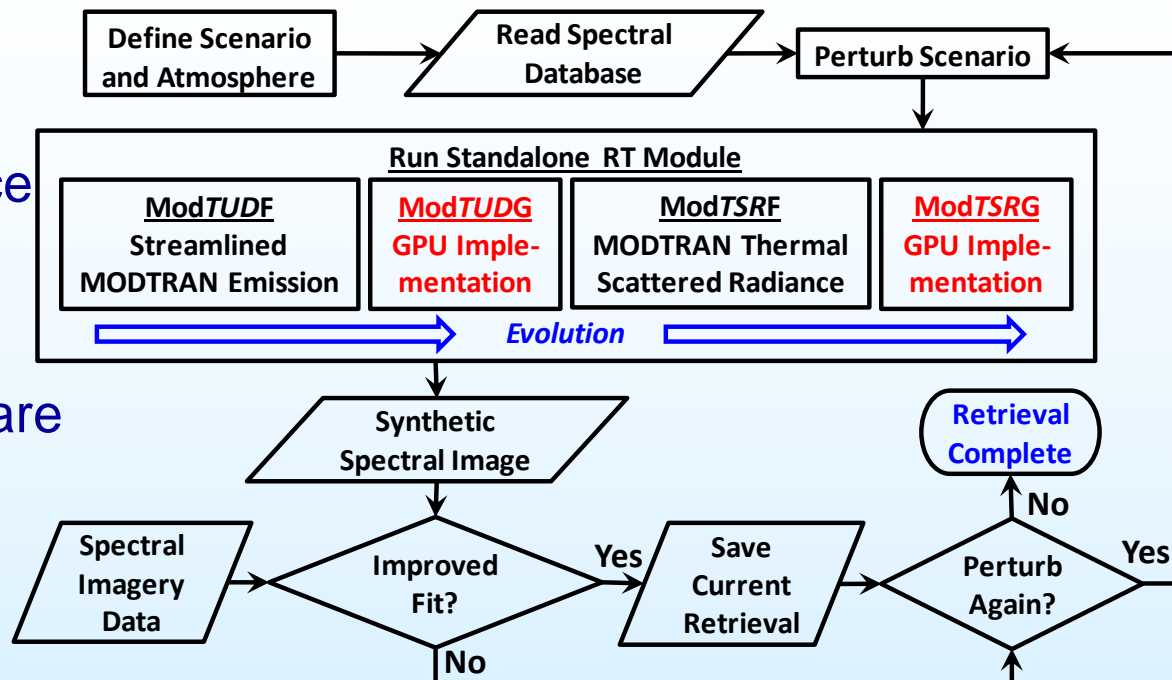
4. Implement emission algorithm on a GPU with Plume Tracker

5. Streamline MODTRAN TIR scattering algorithm

6. Implement scattering algorithm on a GPU with Plume Tracker

7. Verify GPU MODTRAN/Plume Tracker against serial models (SSI)

8. Validate GPU Plume Tracker against Data (JPL)







# Effort Requirements and Desired Enhancements

- MODTRAN special function routines provide >13 place accuracy
  - Faster and/or GPU-tailored routines of radiometric accuracy
- Chemical (SO<sub>2</sub>) releases modeled as infinite layer (spherical shell)
  - Implement local chemical option
- Plume Tracker is based on MODTRAN3.5 (circa 1997)
  - Transition from Mod35 ⇒ Mod53
  - Transition from Mod53 ⇒ *NextGen MODTRAN*
- MODTRAN is run multiple times per pixel (does use hash table)
  - Further reduce number of runs
- GPU version of 2-Stream Thermal Scatter
  - GPU version of DISORT-Thermal
- Band Model Radiative Transfer
  - Correlated-k Radiative Transfer

**Requirements**

**Desired Enhancements**



# Leveraging AFRL Rapid Innovation Funding (RIF) Program: NextGen MODTRAN (01 Oct 2012 Start Date)



- Primary Focus: **Modernization of MODTRAN Software**

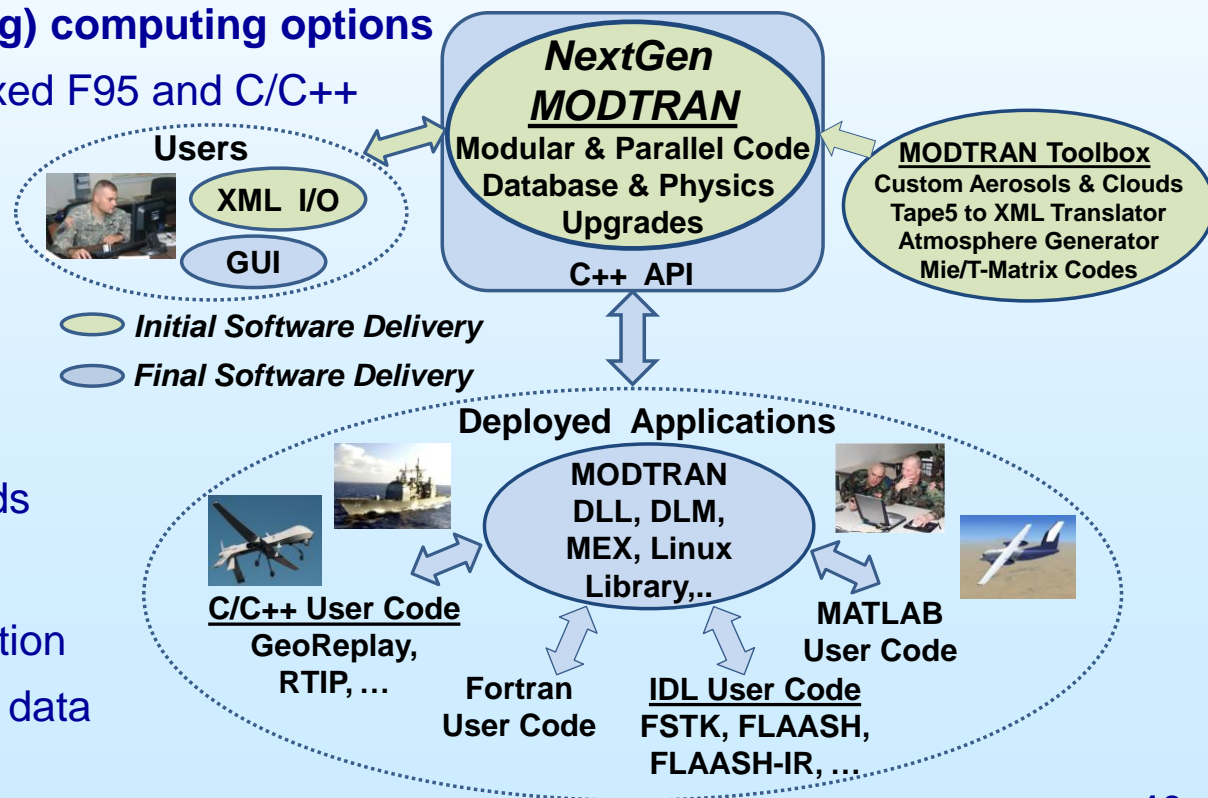
- Retain the full functionality of MODTRAN
- Introduce modern architecture to insure accessibility to scientists / engineers
- Modularize MODTRAN components
- C/C++ I/O and interface with Graphical User Interface (GUI)
- **Parallel (multi-threading) computing options**
- Upgrade from F77 to mixed F95 and C/C++
- Software Documentation

- MODTRAN Toolbox

- Atmosphere generator
- Tape5 to XML translator
- Scattering models
- Custom aerosols & clouds

- Physics upgrades

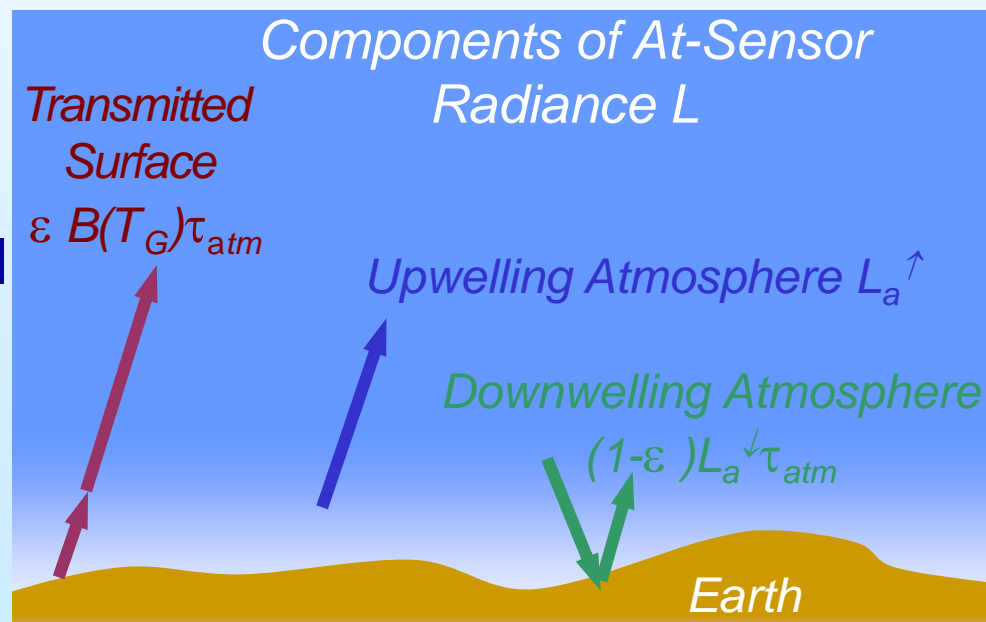
- Line-by-line (LBL) RT option
- Updated HITRAN-based data





# PlumeTracker Interface to MODTRAN

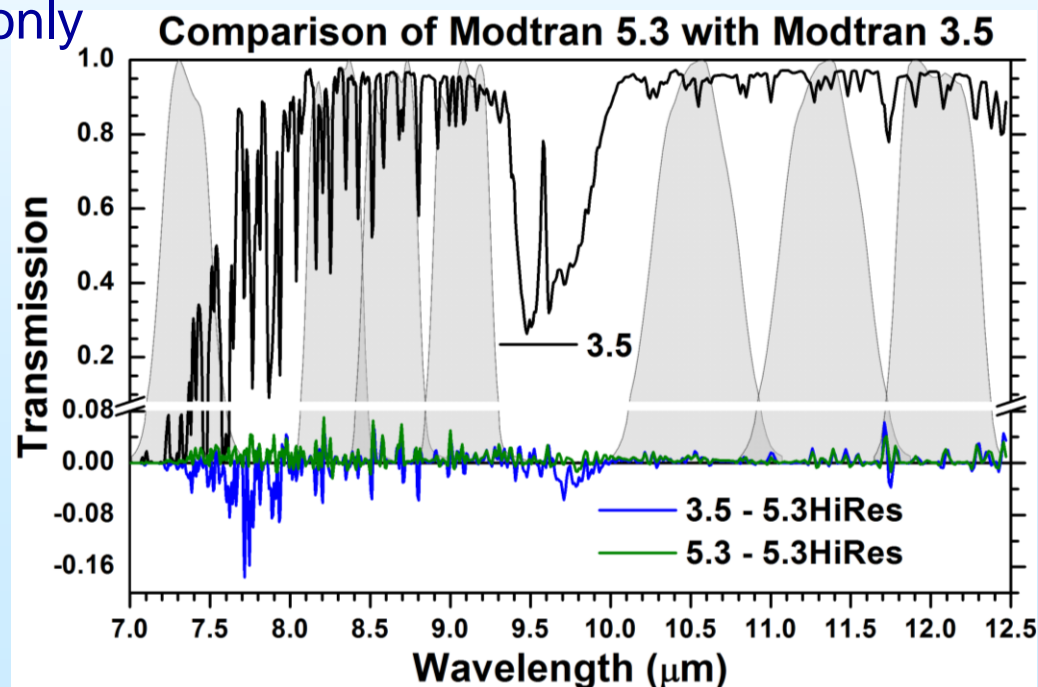
- PlumeTracker (Map\_SO2) uses MODTRAN3.5 (circa 1997)
  - JPL created MODTRAN3.5 API interfaced through a Mod35.dll file
  - I/O passed in argument list including inputs not standard in 1997
    - Molecular profiles scaling factors
    - Surface spectral albedo
  - Spectral **TUD** outputs stored in dynamically-allocated arrays
    - Transmitted surface emission
    - Up-welling path radiance
    - Down-welling flux reflected by surface, transmitted to sensor
- Includes IDL front end GUI
  - Drives retrieval algorithm
  - C/C++ interfaces Mod35.dll
  - Multiple MODTRAN runs for each image pixel
  - Hash table





# Updating PlumeTracker to Modtran5.3

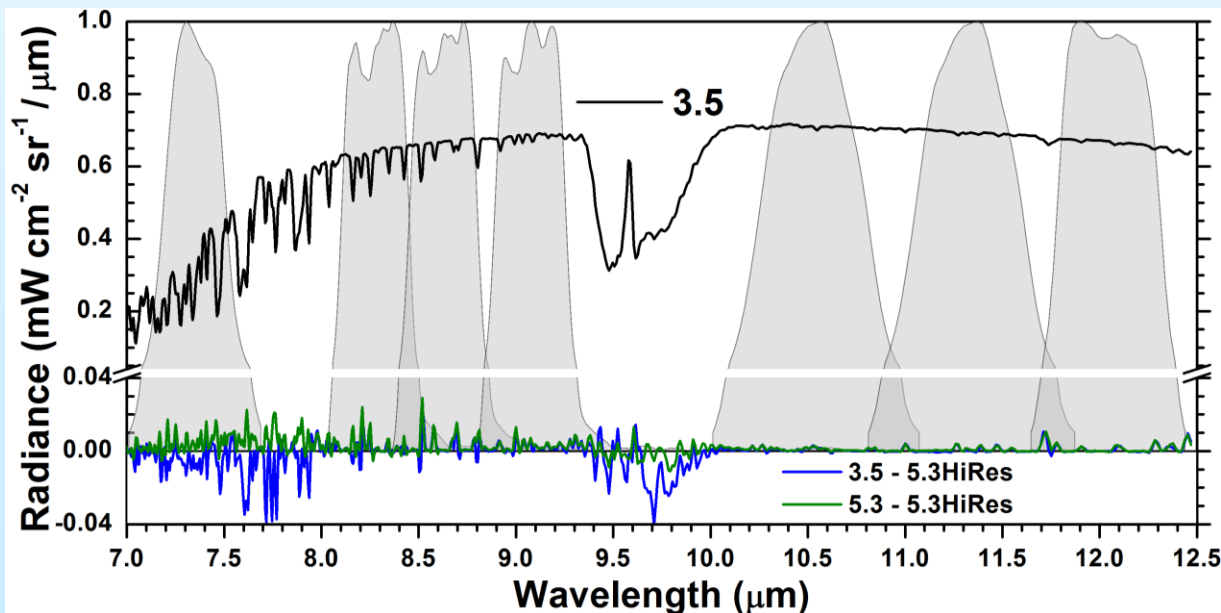
- I/O arguments were left unchanged in initial update
- Replacement Mod53.dll file produced and being tested
  - Stand-alone and integrated results compared to Mod35.dll
  - More testing required
- Entry routine arguments to be pared down
  - Current or potential inputs only
  - Will ease maintenance and simplify documentation
- Plan transitioning to NextGen MODTRAN
  - Standardize API
  - Multi-threading capability
  - Enhanced performance





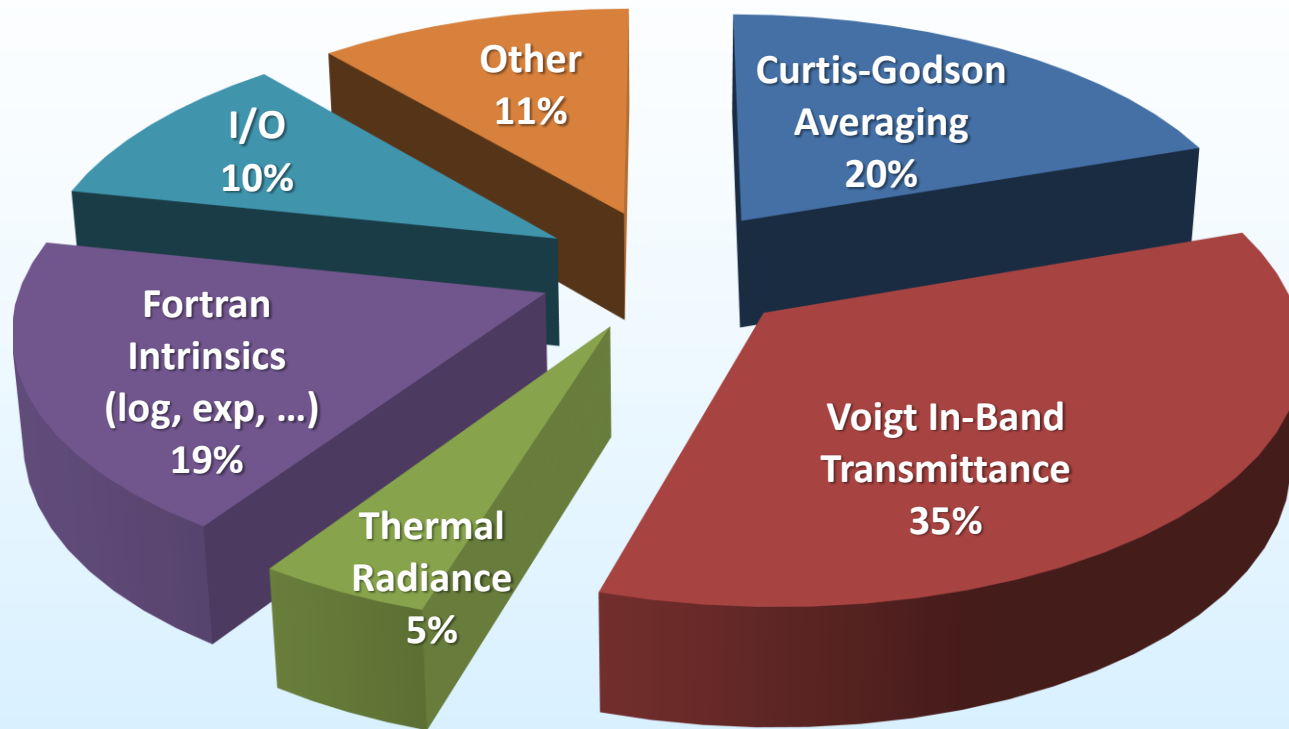
# 3.5 vs 5.3 Radiances

- Scenario
  - 45° off-nadir from 20.4 km
  - Pacific in April radiosonde
  - 380 ppmV CO<sub>2</sub>, 80 km visibility
  - 2 km altitude ground, 0.9 emissivity
- Updated Model Elements
  - HITRAN 2009 Band Model (BM) Data
  - 4 parameter band model, Padé fit tails
  - Voigt in-band transmittance
- Upgraded Thermal Radiance Method
  - DISORT 8-Stream scattering
  - Statistical Correlated-*k* Algorithm
  - 0.1 cm<sup>-1</sup> band model
- Results
  - 0.5 sec (5.3), 58 sec (5.3 HiRes)
  - 4-parameter BM improves 9.6μm O<sub>3</sub>
  - Updated transmittance algorithm and 1997 ⇒ 2009 data reduce residuals





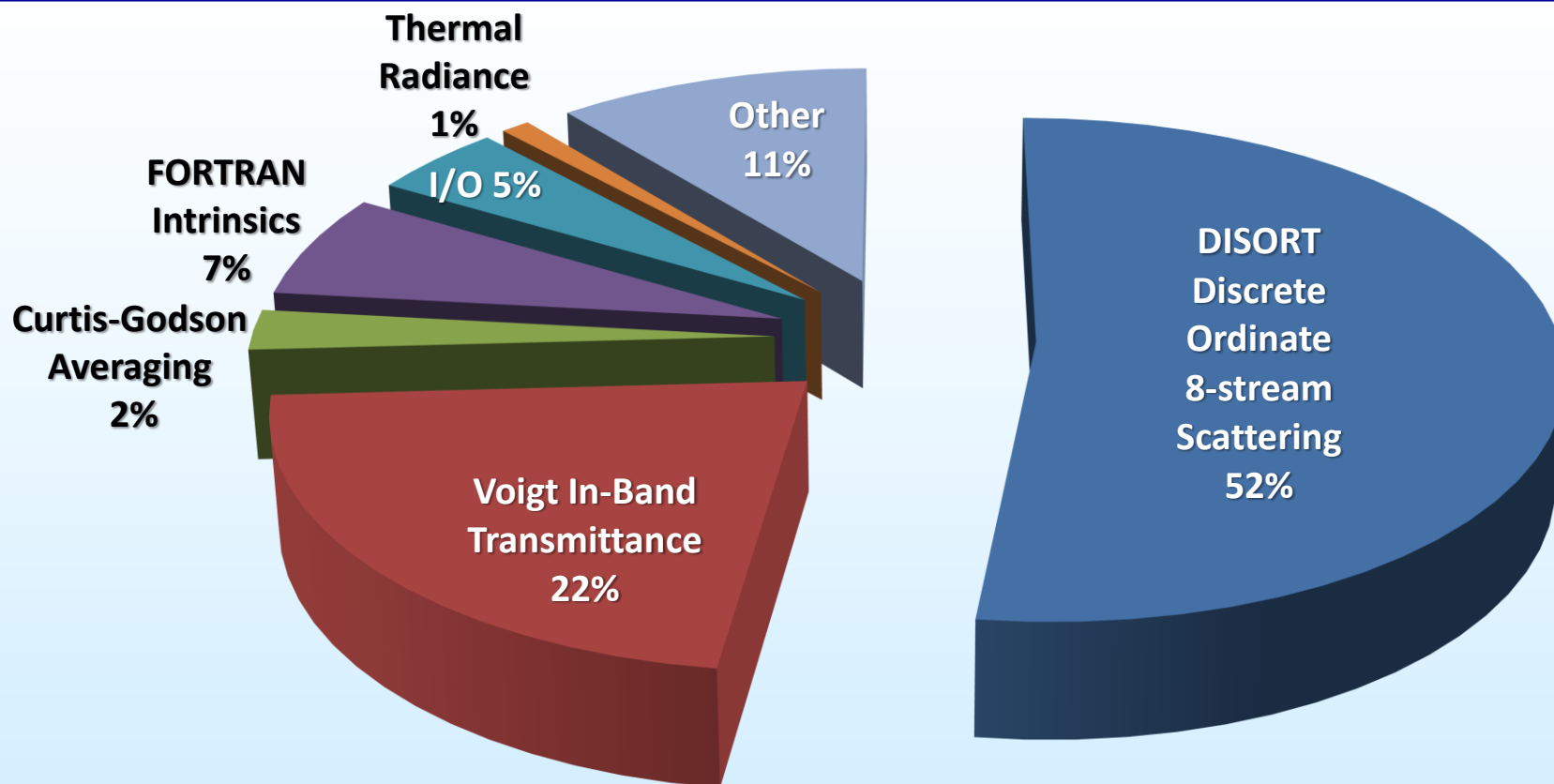
# Profiling of MODTRAN Thermal Emission and 2-Stream Scattering



- Curtis-Godson Averaging is a precursor to transmittance
  - Curtis-Godson not used with Correlated-k algorithm
- Current transmittance calculations bogged down by Bessel function and Voigt line shape evaluations



# Profiling of MODTRAN Thermal Emission and **DISORT** Scattering



**DISORT** is bottleneck when used for thermal multiple scatter

- Discrete ordinate method is a matrix formulation
- GPU linear algebra libraries are readily available

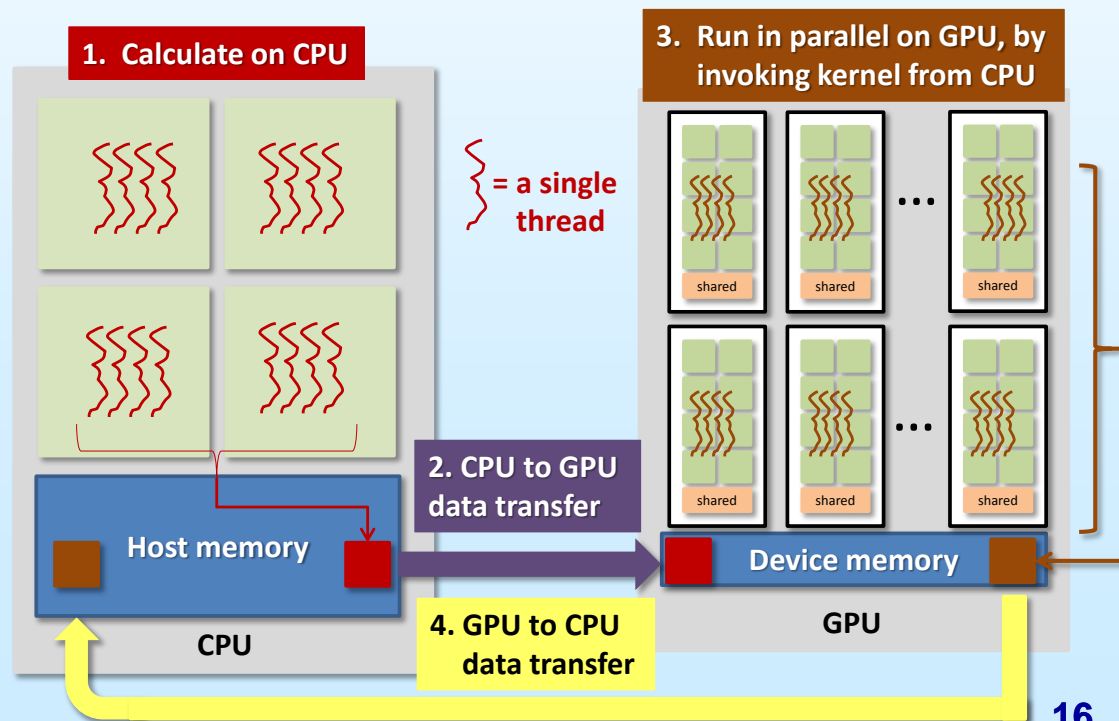


# Parallel RT Architecture



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- Convert RT code functions to maximize use of GPU parallel resources
  - GPU hardware favors independent calculation pathways & sequential memory access
  - Trends in GPU hardware moving towards higher floating-point throughput per thread
  - Fewer threads, more computation per thread
- Re-organize sequential steps of numerical routines into independent vectorized calculations
  - Focus on “loop”-based operations spanning a frequency/molecular grid
- Architecture changes will occur internal to MODTRAN, localized to the most computationally expensive routines
  - Matrix transforms, Voigt line shape, Bessel functions, etc.
- Parallel vector operations are implemented with GPU programming libraries (NVIDIA CUDA-based)

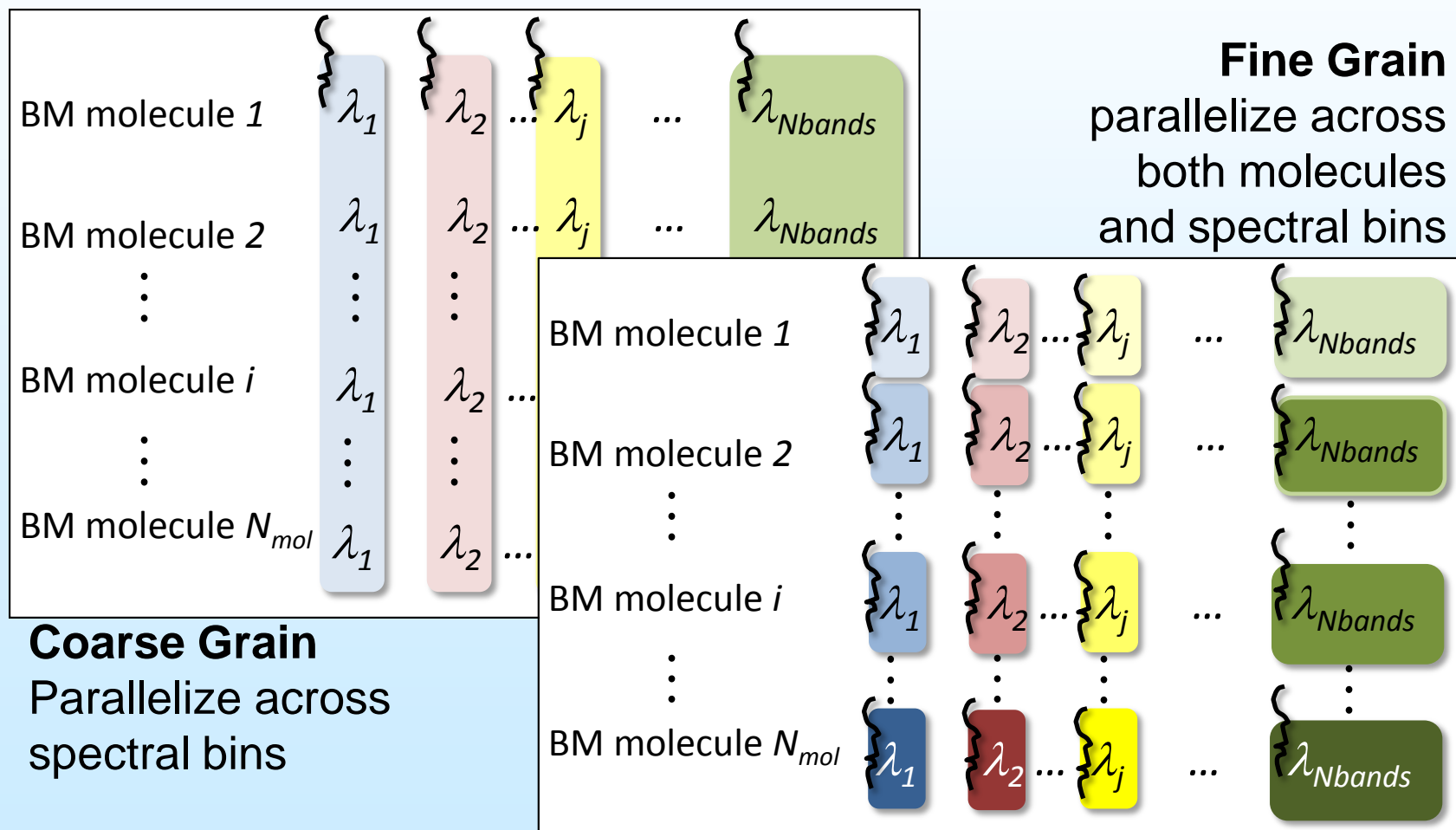






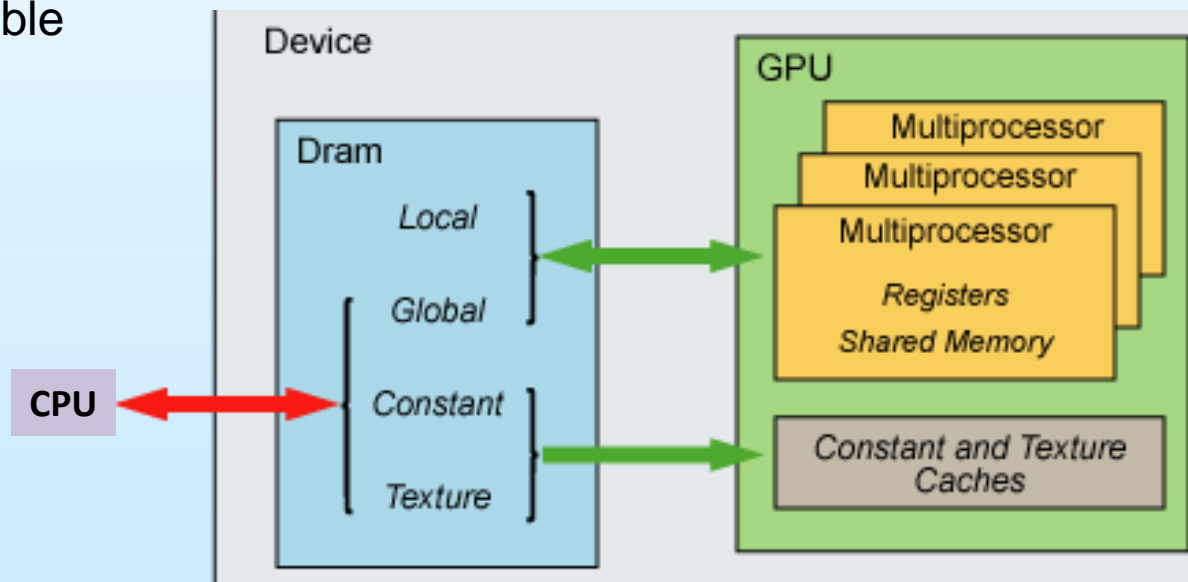
# Preliminary GPU Parallelization

- Initial GPU thread workload: Voigt and Bessel functions
  - Future GPU thread workload: Voigt In-Band Transmittance





- Restructure code and data layout being optimized for GPU
- Data storage on GPU
  - Band model data stored in (read-only) constant memory
    - 64K constant memory per GPU
    - *< 1K band model data per active-molecule/spectral-bin*
    - Ensure adjacent threads within block access adjacent memory
    - If necessary, texture memory also available
  - Registers used for Voigt in-band transmittance
  - Transmittance arrays saved in shared memory





# Summary: Progress to Date

- Documentation
  - Tutorial and Algorithm Theoretical Basis Document (ATBD)
  - Voigt In-Band Transmittance Paper (submitted to JQSRT)
  - Details of MODTRAN / DISORT Integration
- Integration of MODTRAN5.3 in Plume Tracer
  - Initial integration complete
  - Undergoing testing
- GPU implementation
  - Time Profiled Plume Tracker runs
  - Identified Bottlenecks
  - Initiated testing of GPU tailored functions
- Please stay tuned!
  - [www.modtran5.com](http://www.modtran5.com) or [lex@spectral.com](mailto:lex@spectral.com)



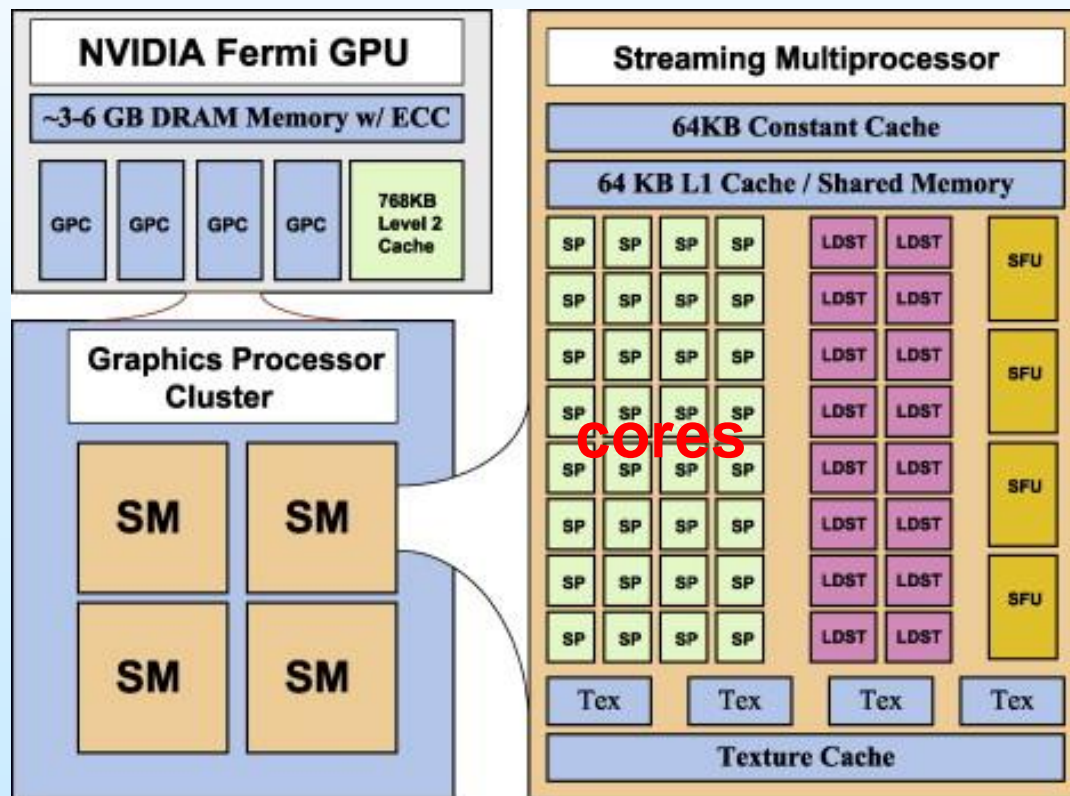
# *Back-Ups Follow*





# GPU Hardware

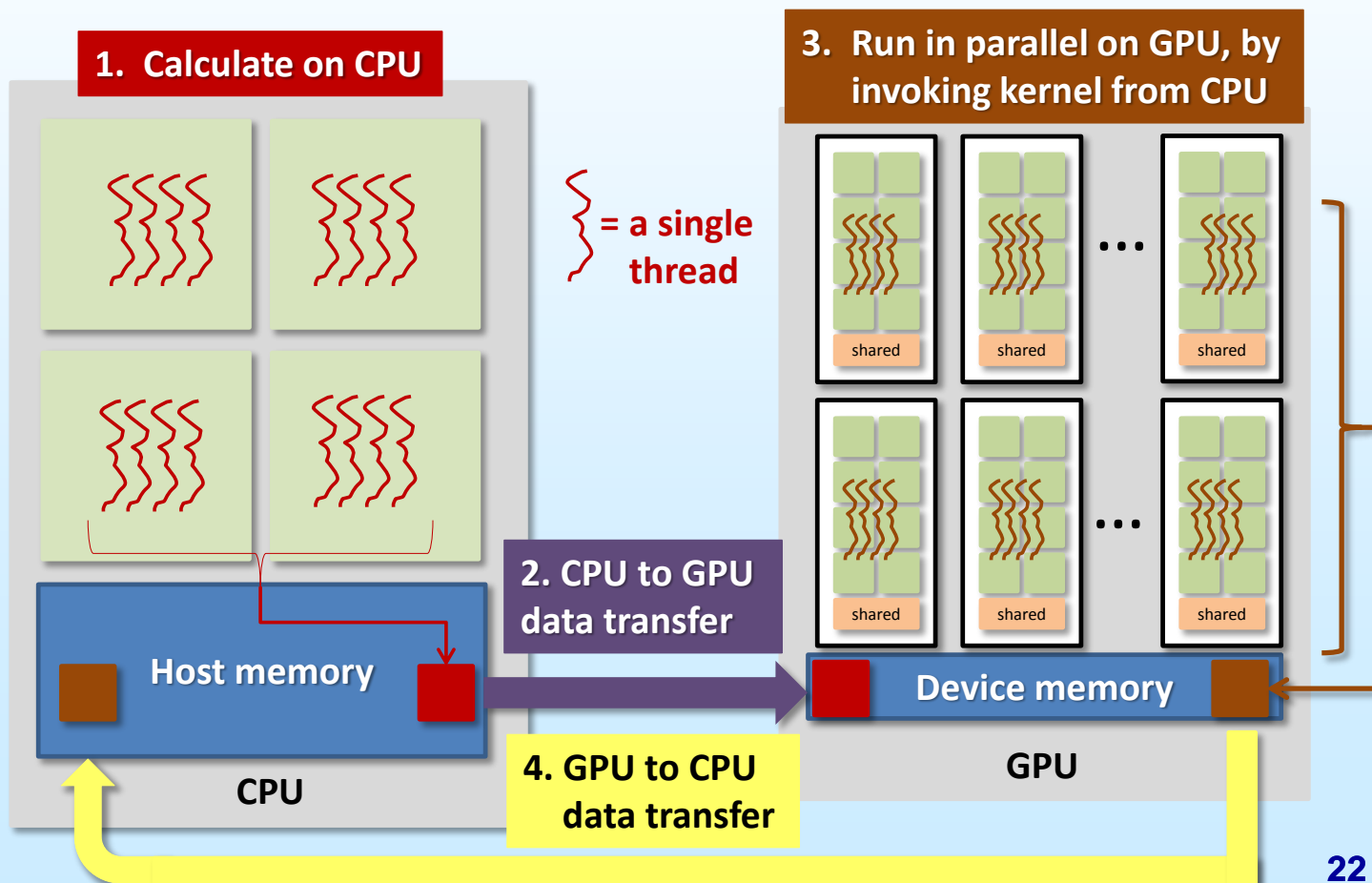
- A GPU consists of
  - Multiple Streaming-Multiprocessors (SM's), and
  - 3-6 GB Dynamic RAM global (or device) memory visible to all SMs
- Each SM consists of multiple cores that have access to
  - a common pool of shared memory and cache (in newer GPUs)
  - very fast registers with limited memory
- Constant and texture memory provide fast, cached storage for the SM.





# CUDA Process Flow

“CUDA is a parallel computing platform and programming model that enables dramatic increases in computing performance by harnessing the power of the graphics processing unit (GPU)”





# General GPU performance considerations

- Memory
  - Minimize data transfers between the CPU and device
  - Access latency hierarchy: *global memory* > *shared memory* > *registers*
  - Coalesce global memory access across threads in a block to maximize bandwidth
  - Maximize FLOPS-to-memory access ratio

- Multi-threaded execution

- Avoid divergent execution by grouping identical tasks in a thread block
- Ensure load-balanced workload
- Overlap thread data transfer and execution by using asynchronous data transfer calls

