

The importance of Biomet information to interpret Eddy Covariance data

LI-COR Eddy Covariance Training - ChinaFlux

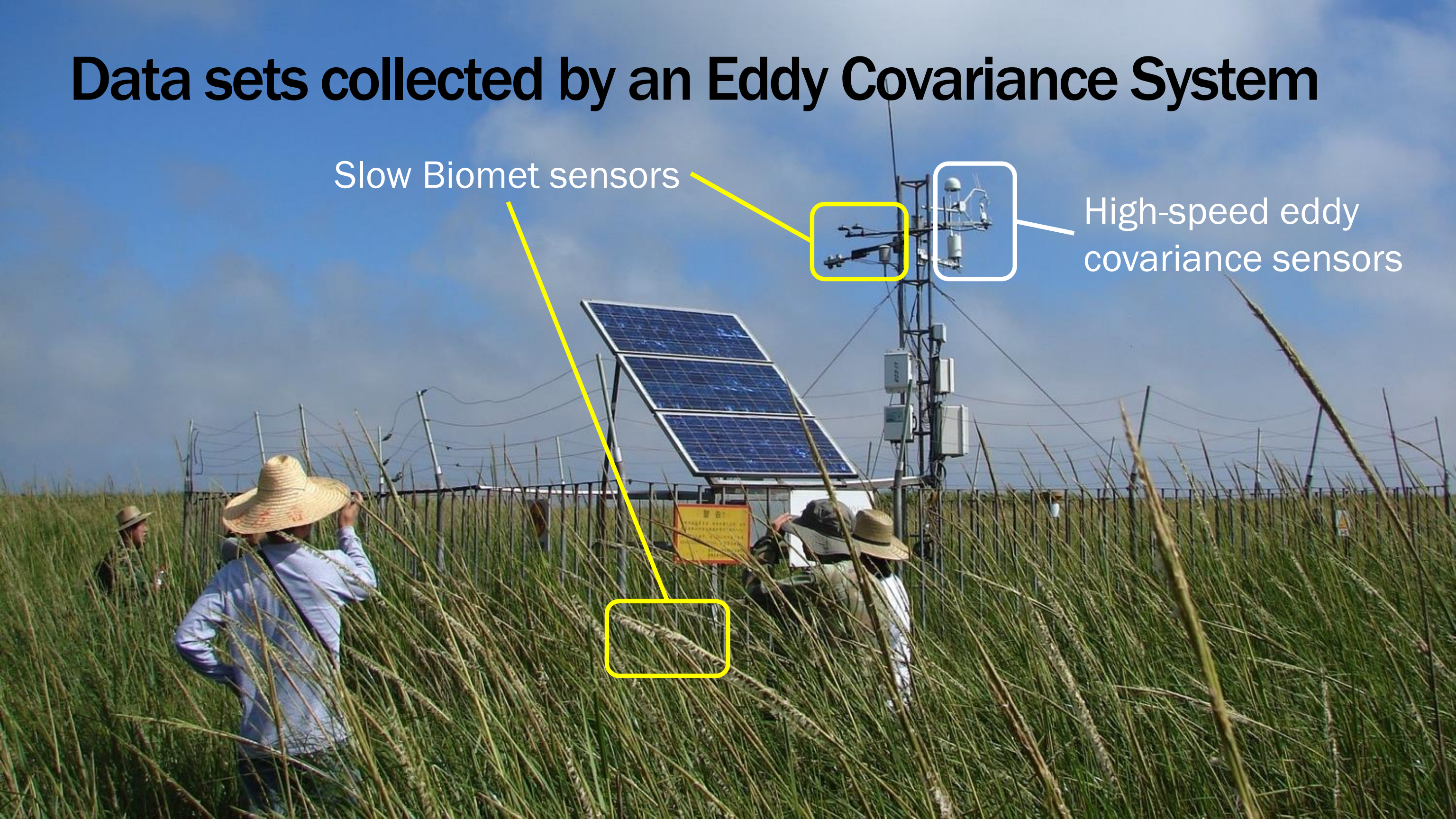
August 22, 2022

Dave Johnson

Data sets collected by an Eddy Covariance System

Slow Biomet sensors

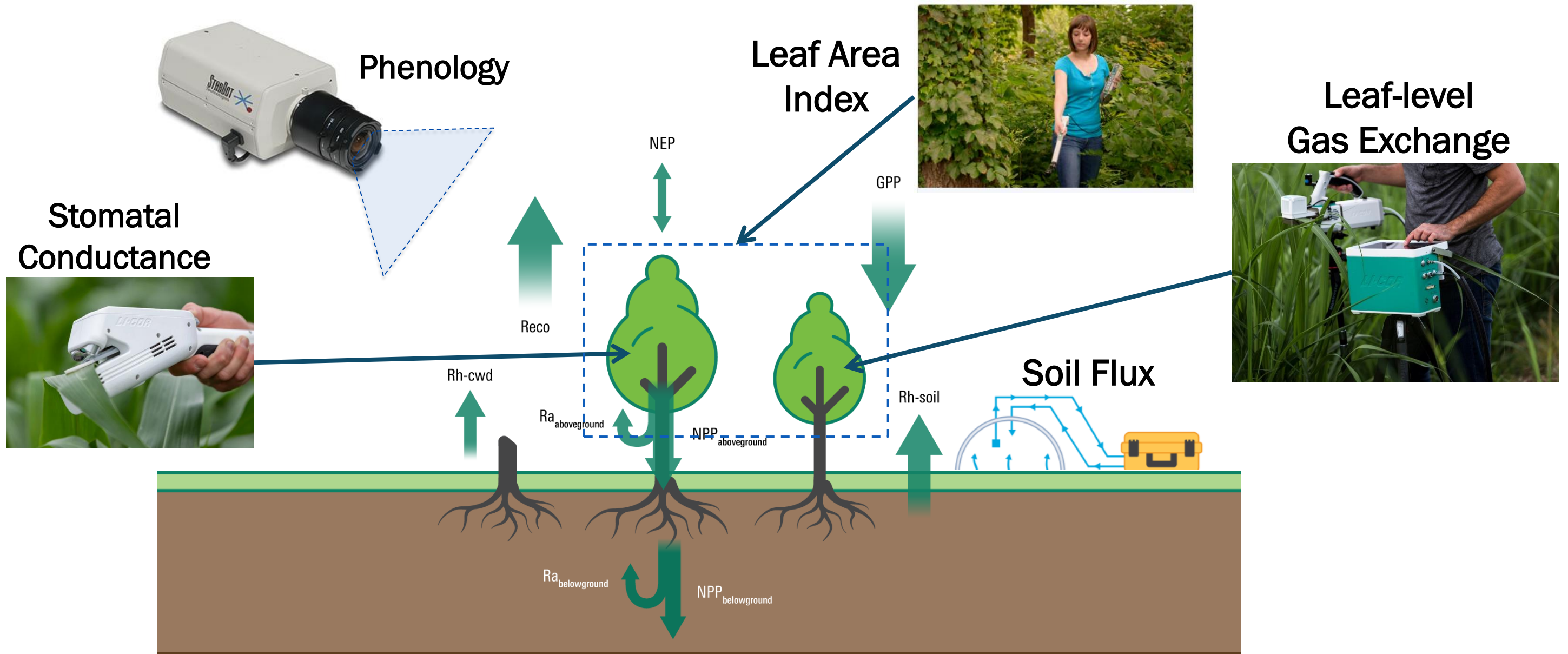
High-speed eddy covariance sensors



What are 'Biomet' Sensors?

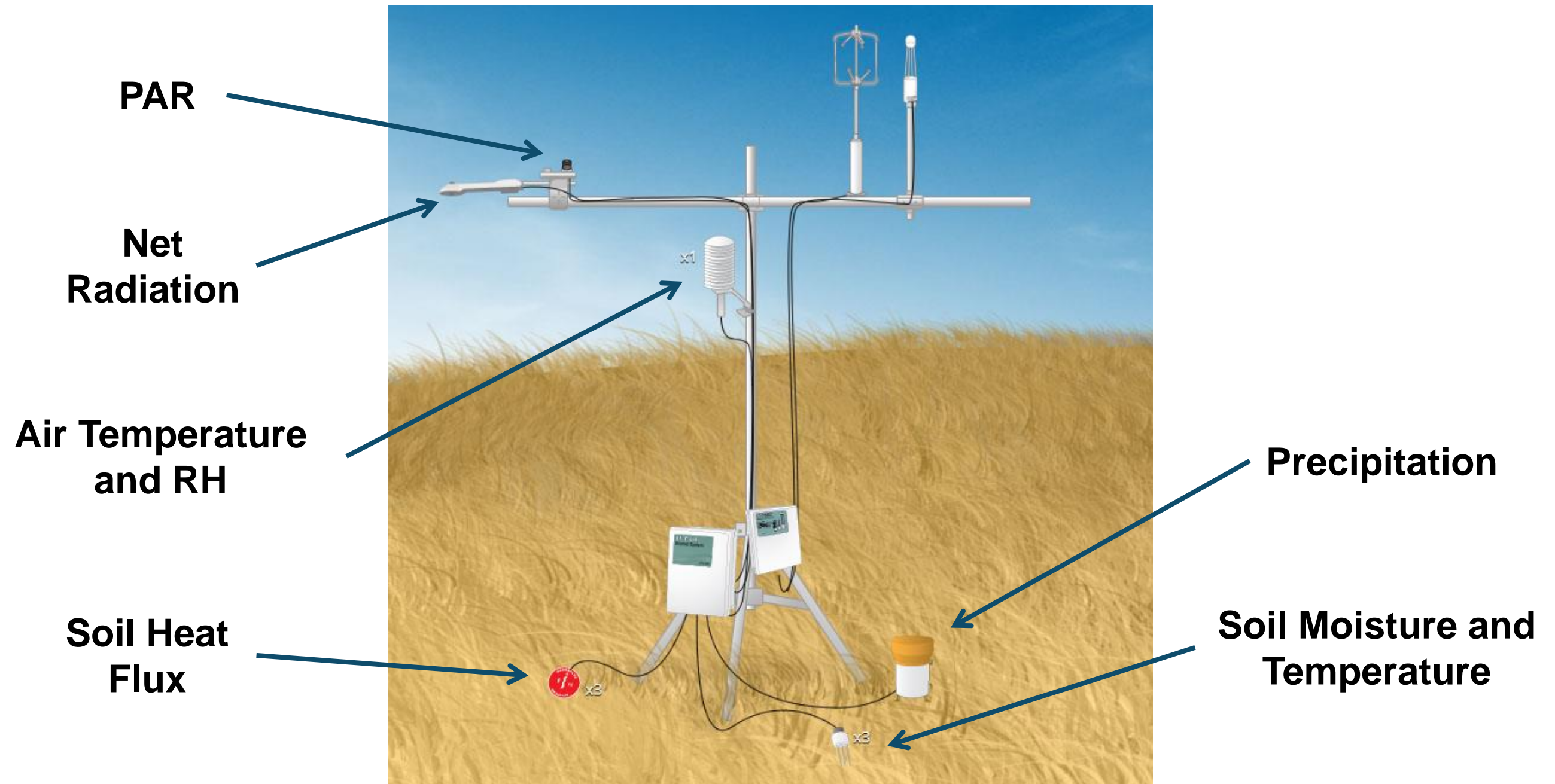
- Sensors used for monitoring the environment (**biological** and **meteorological**).
- Biological sensors are typically used periodically to measure biological functions.
- Meteorological sensors typically measure once per second to once per minute.

Biomet Measurements: Biological variables



Lots of processes; Leaf and Soil level

Biomet Measurements: Meteorological variables



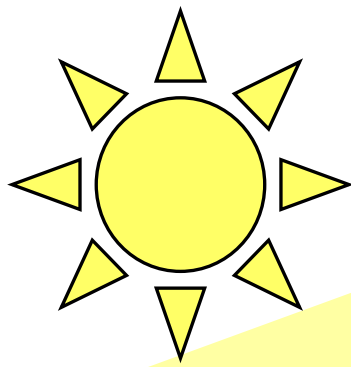
Biomet Sensors

- Why do we need additional Biomet measurements?
 - We can already calculate flux measurements from the *sonic anemometer* and *gas analyzer* data...

Why collect Biomet measurements?

- Quality Assurance and Quality Checking (QA/QC)
 - Energy Balance closure.
- Recording weather helps to explain site behavior
 - The physical environment has profound effects on the biology as well as on the surface-atmosphere exchange.
- For Data Analysis
 - Gap filling – When instrumentation or power fails.
 - Partitioning – separating NEE into GPP and R_{ECO}
- Improving Fluxes

The Energy Budget (daytime)



$$R_n = H + LE + G + S + Q$$

All terms have units of ($W m^2$).

R_n ~ net radiation flux density

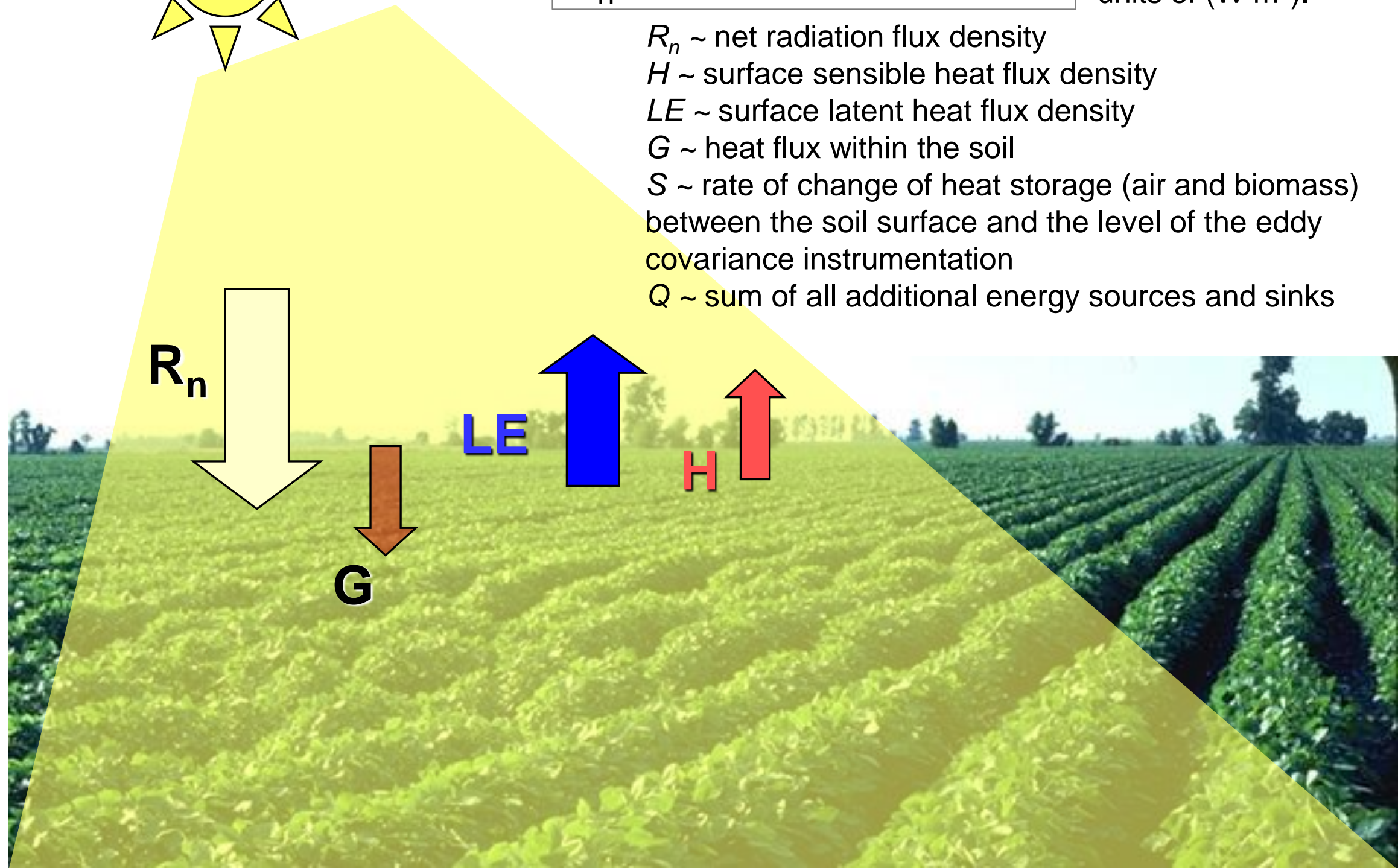
H ~ surface sensible heat flux density

LE ~ surface latent heat flux density

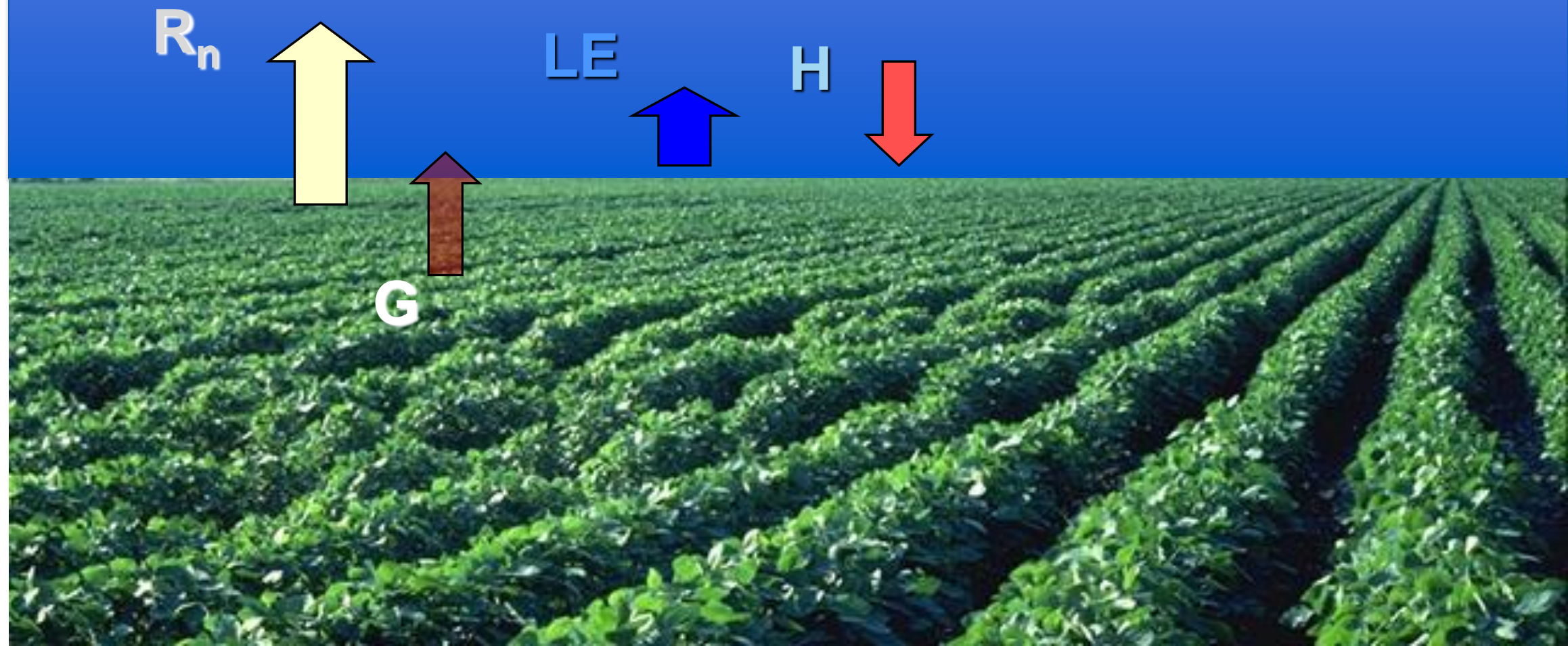
G ~ heat flux within the soil

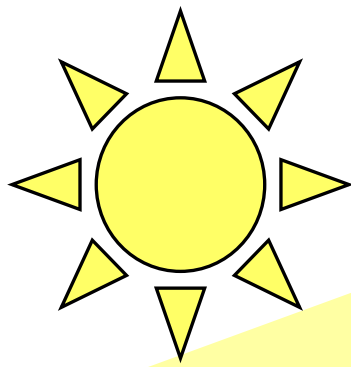
S ~ rate of change of heat storage (air and biomass) between the soil surface and the level of the eddy covariance instrumentation

Q ~ sum of all additional energy sources and sinks



The Energy Budget (nighttime)





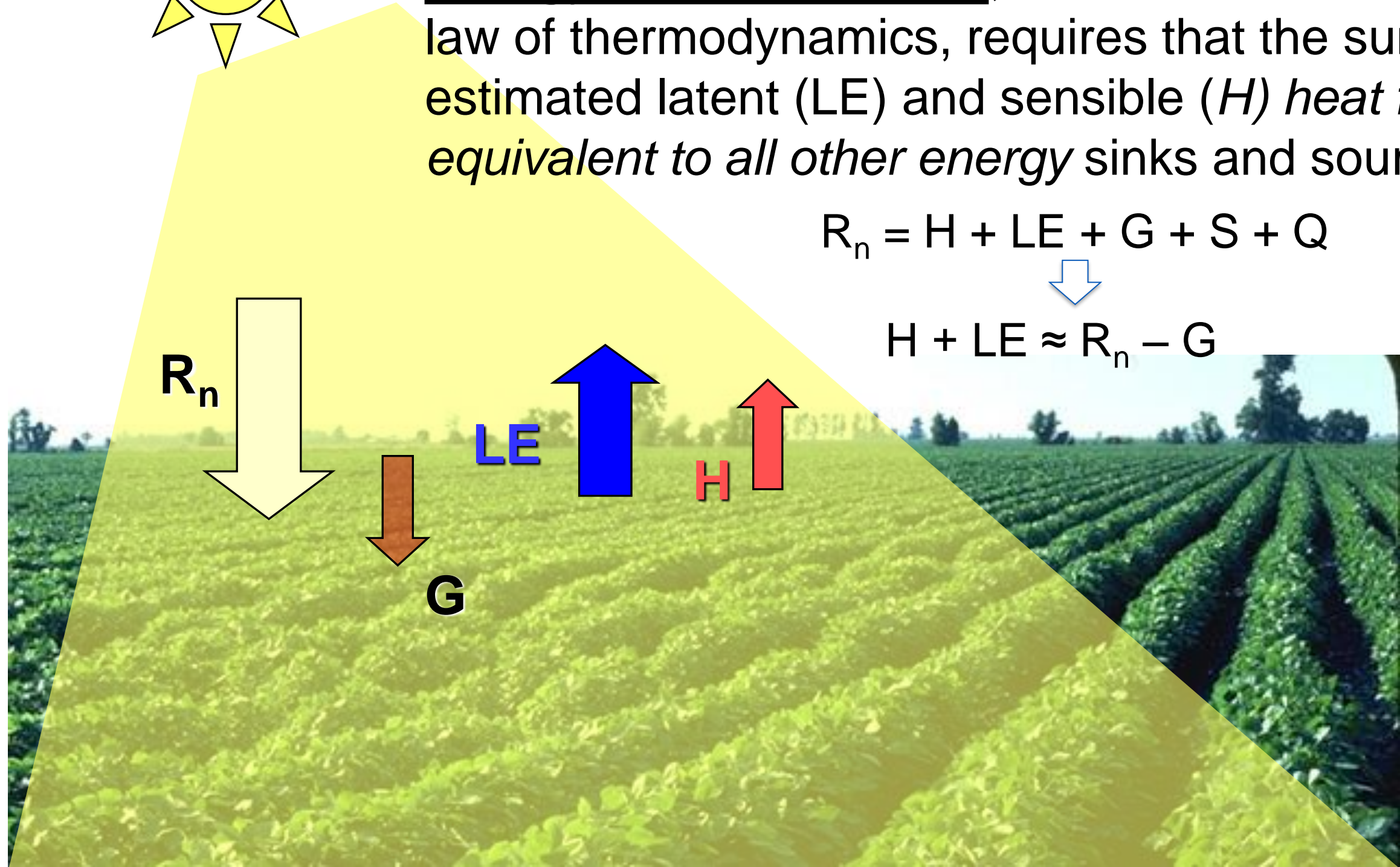
The Energy Budget

Energy balance closure, a formulation of the first law of thermodynamics, requires that the sum of the estimated latent (LE) and sensible (*H*) *heat flux be equivalent to all other energy sinks and sources*

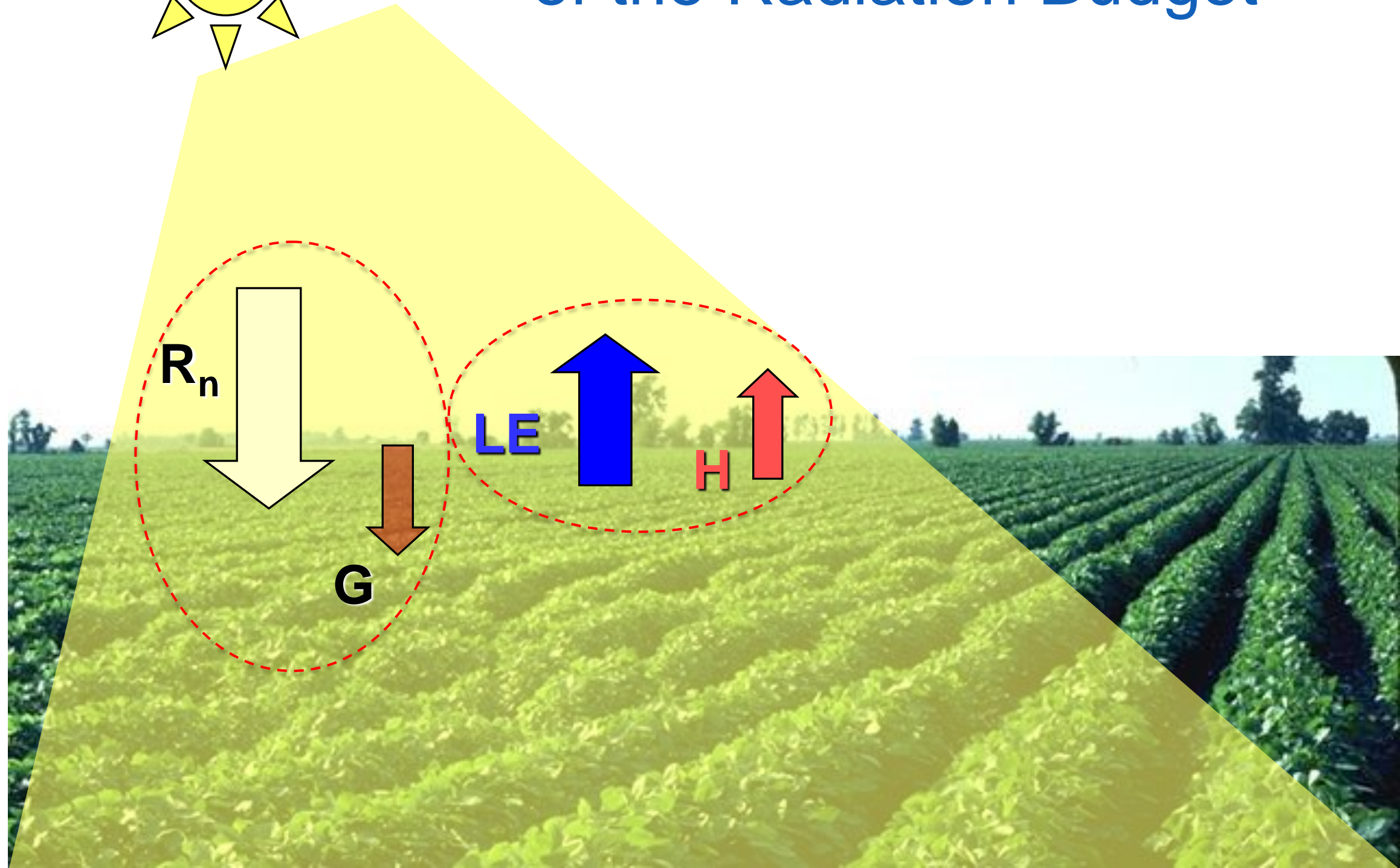
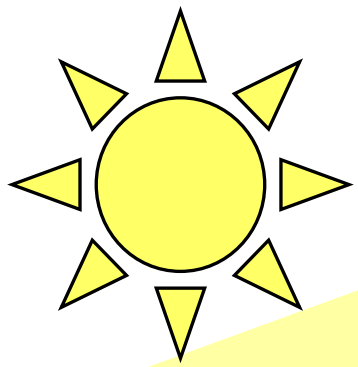
$$R_n = H + LE + G + S + Q$$



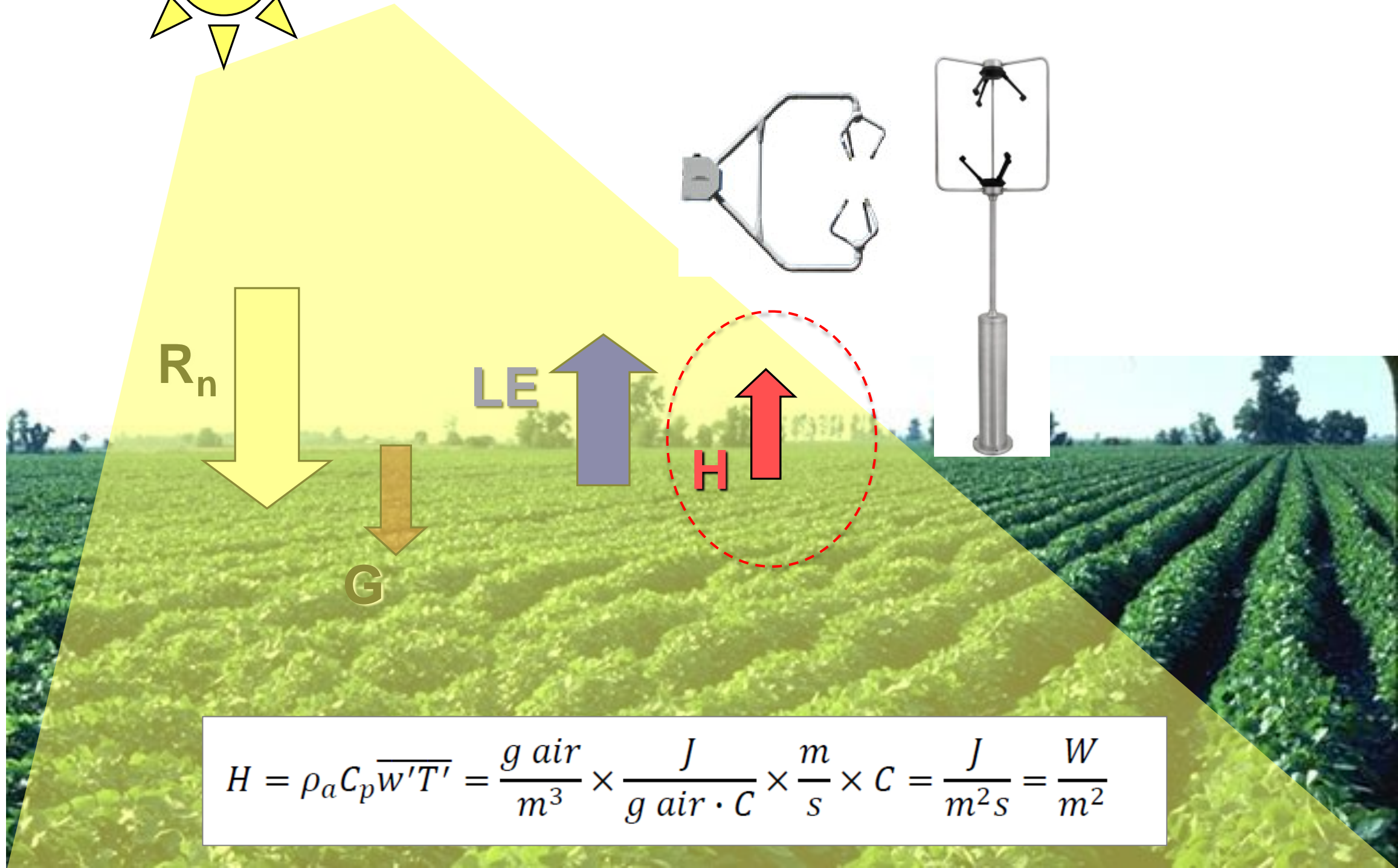
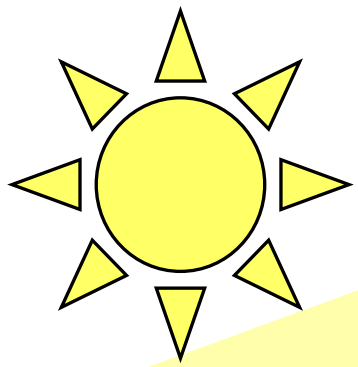
$$H + LE \approx R_n - G$$



Measuring the components of the Radiation Budget

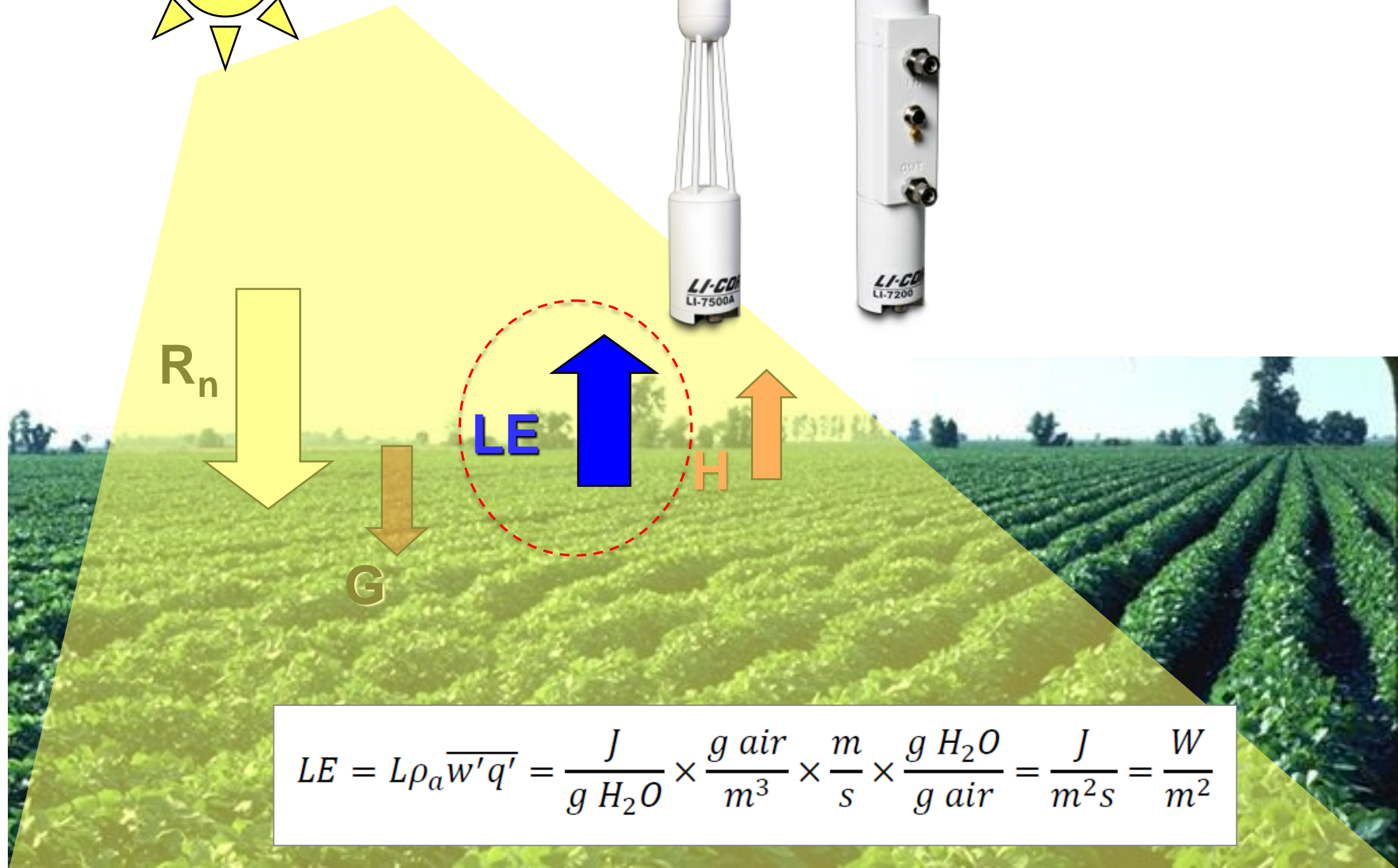
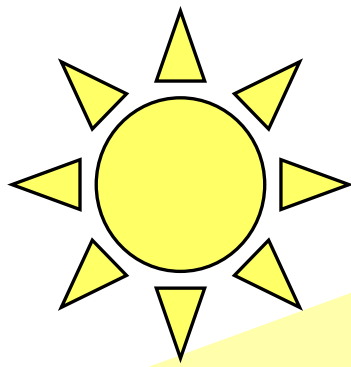


Measuring Sensible Heat (H)



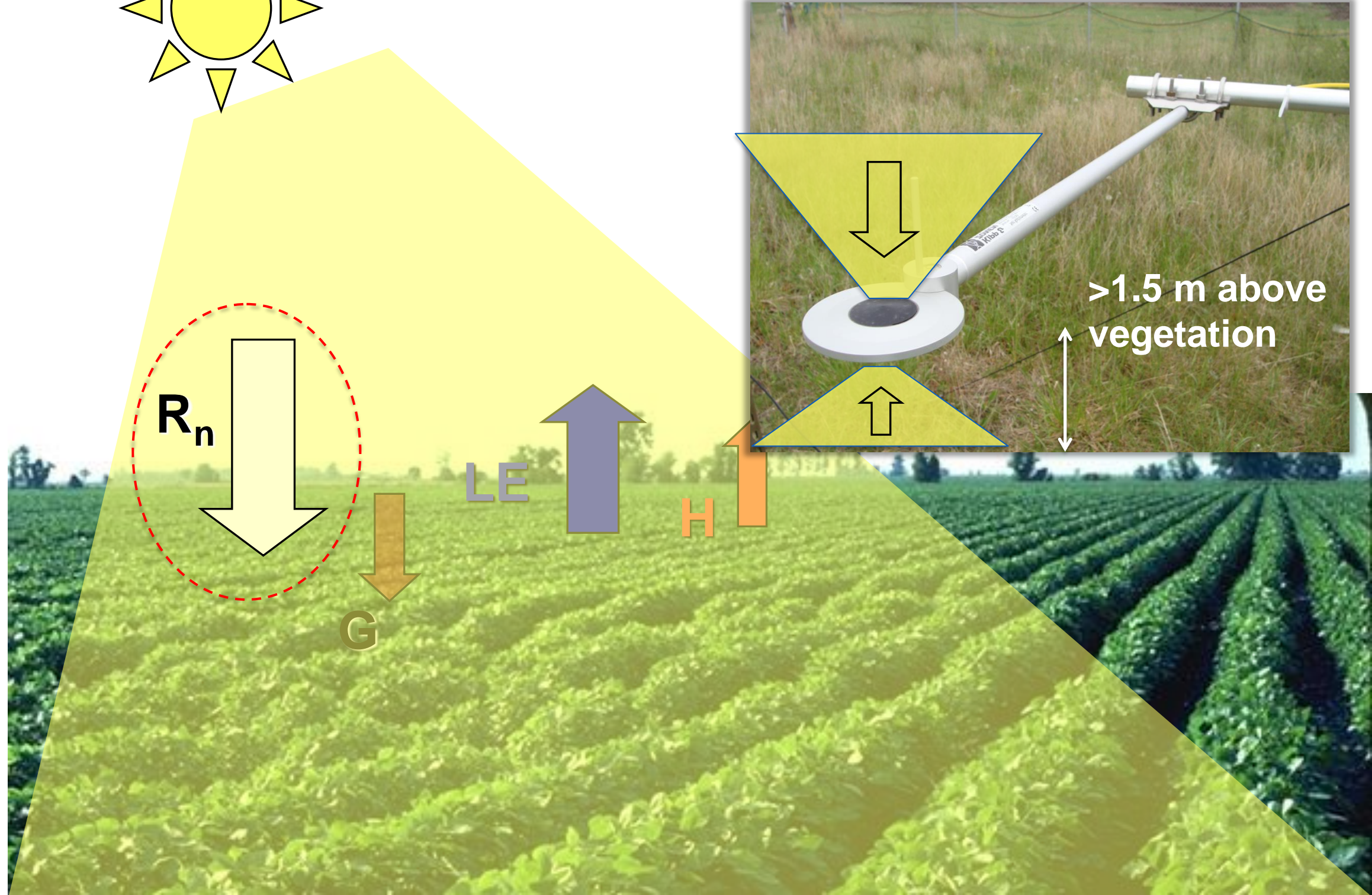
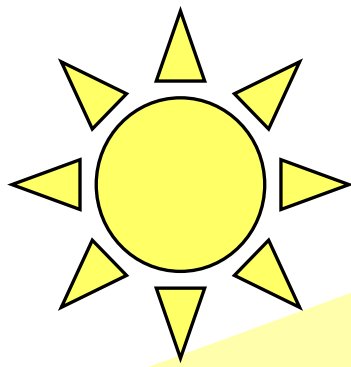
$$H = \rho_a C_p \overline{w'T'} = \frac{g \text{ air}}{m^3} \times \frac{J}{g \text{ air} \cdot C} \times \frac{m}{s} \times C = \frac{J}{m^2 s} = \frac{W}{m^2}$$

Measuring Latent Energy (LE)



$$LE = L\rho_a \overline{w'q'} = \frac{J}{g H_2O} \times \frac{g \text{ air}}{m^3} \times \frac{m}{s} \times \frac{g H_2O}{g \text{ air}} = \frac{J}{m^2 s} = \frac{W}{m^2}$$

Measuring Net Radiation (R_n)



>1.5 m above
vegetation

Typical Net Radiation Sensors

Kipp & Zonen
NR Lite2
Single component

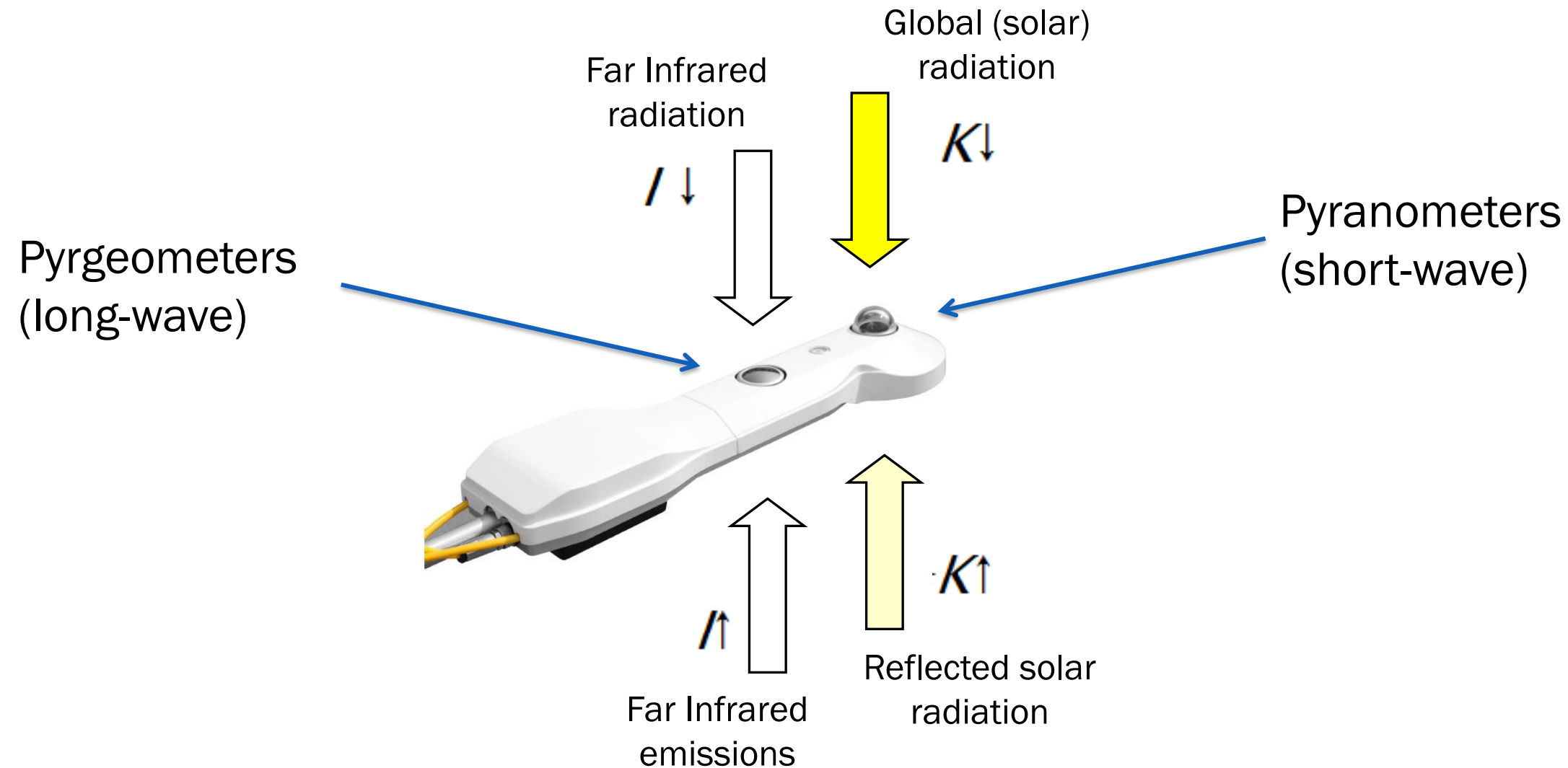


Hukseflux
NR01
Four component

Kipp & Zonen
CNR 4
Four component



The four-component radiometer give more detailed information of the various radiation components



Heating and Ventilation can help with the continuous collection of good data

Heating:

- recommended to activate when there is a risk of dew deposition
 - NR01: 1.5 W at 12 VDC
 - CNR4: 10 W at 12 VDC

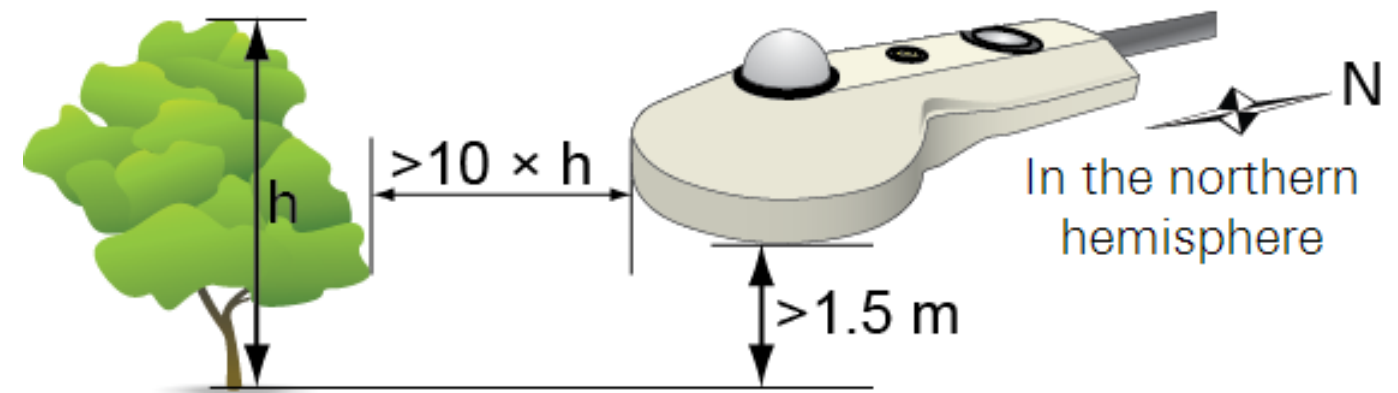
Ventilation:

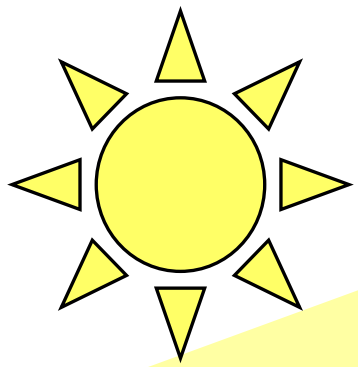
- CNF4 ventilation unit
 - CNR4: 5 W at 12 VDC



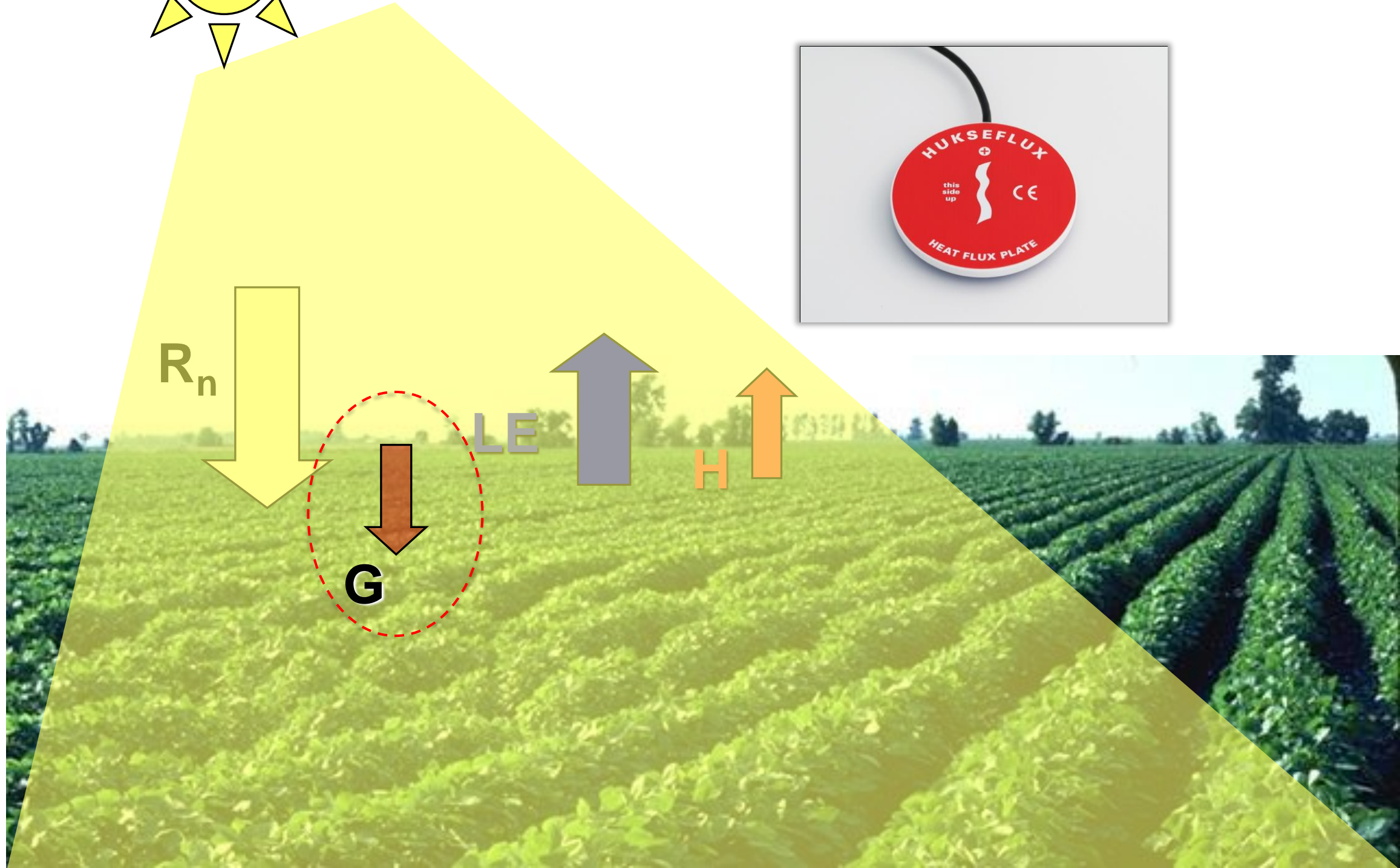
Net Radiation - Installation

- No obstruction and shadows of up/downwards view
- Away from heat source or reflected surfaced
- Orient towards south (northern hemisphere)
- Mount at least 1.5 m above plant canopy
- Mount at least $10 \times h$ away from high vegetation





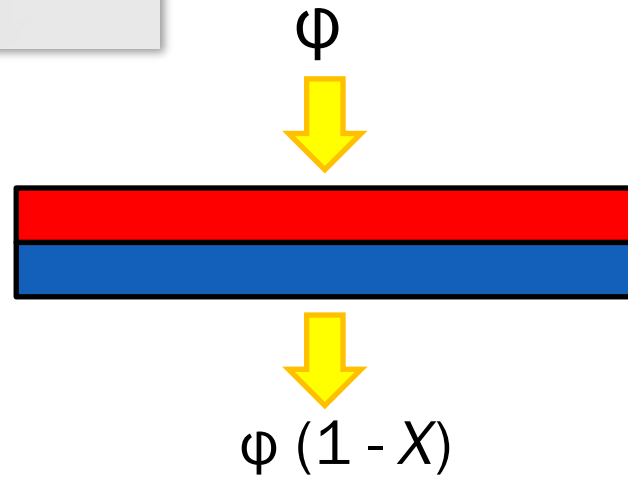
Measuring Soil Heat Flux (G)



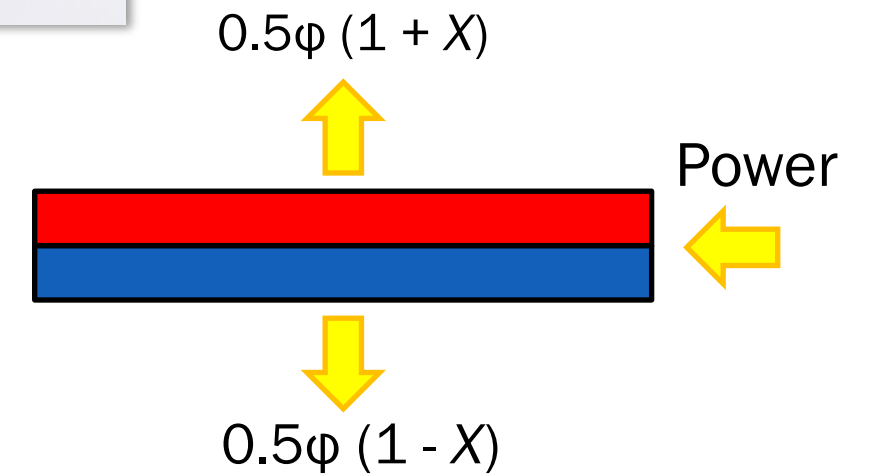
Soil Heat Flux: Measure the heat transfer in the soil



Hukseflux
HFP01
Normal Operation



Hukseflux
HFP01SC
Self-Calibrating



ϕ = heat flux
 X = deflection error

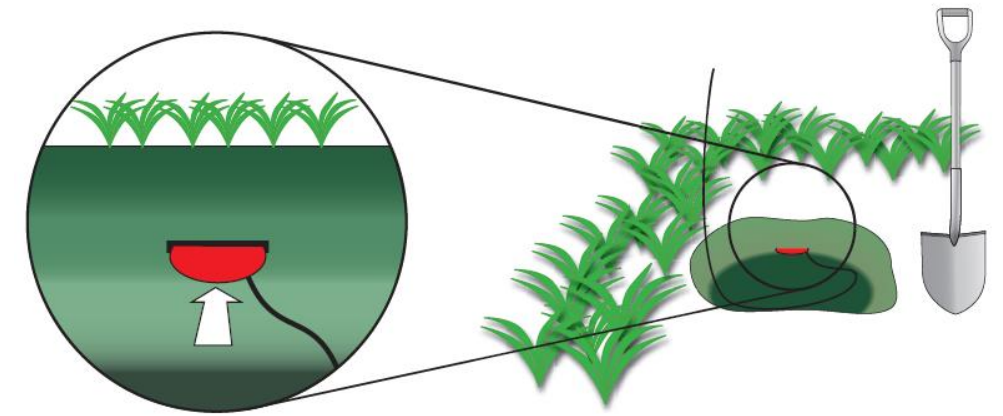
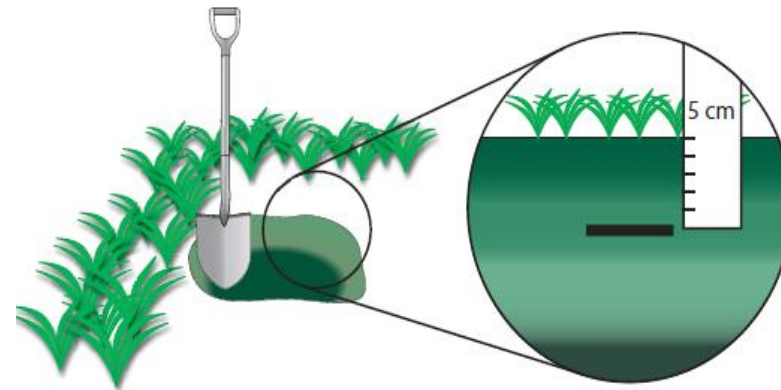
Soil heat flux plates - Installation

Minimum of 3 each:

- Soil variability
- Sun vs. Shade
- 5 m apart

Installation:

- Typically, 5 cm
- Bury with red side up
- Be sure each sensor is completely covered with soil, no air pockets
- Bury a short length of the cable to prevent thermal conduction through wires
- Fill the hole with excavates soil



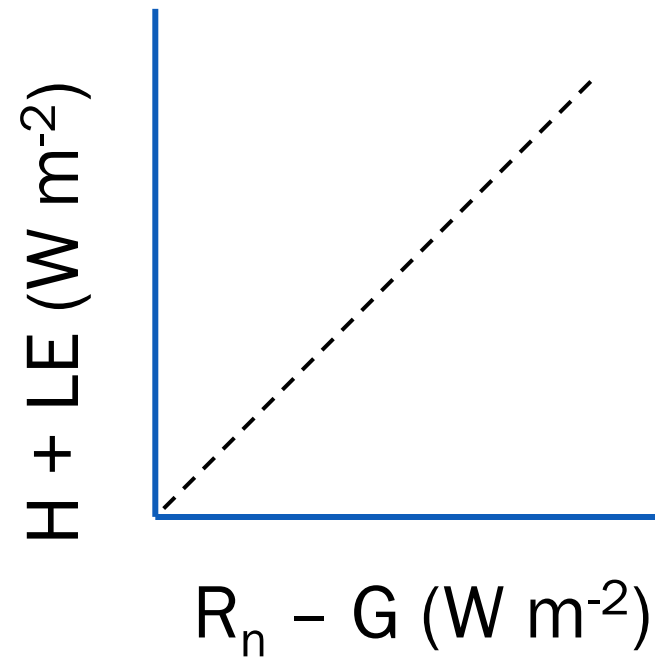
How can the Energy Budget and Energy Balance Closure help us?

- A tool for verifying eddy covariance instrumentation ($\text{CO}_2/\text{H}_2\text{O}/\text{CH}_4$ analyzers and sonic anemometers) are working accurately and are installed properly.
 - Helps verify that final computed flux values are correct and accurate.
- Quality Assurance and Quality Checking (QA/QC).
 - Investigate relationships between half-hourly estimates of dependent flux variables ($LE + H$) against independently derived available energy ($R_n - G$).

Remember ... $H + LE \approx R_n - G$

Checking for energy balance closure

Measured
by the **EC**
System

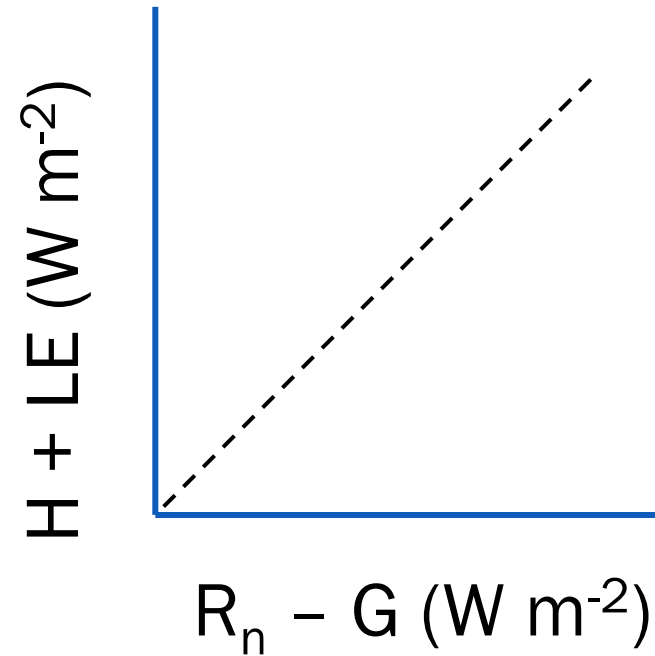


Ideal closure is represented by a
slope of 1 and an intercept of 0.

Measured by
the **Biomet**
System

Checking for energy balance closure

Measured
by the **EC**
System



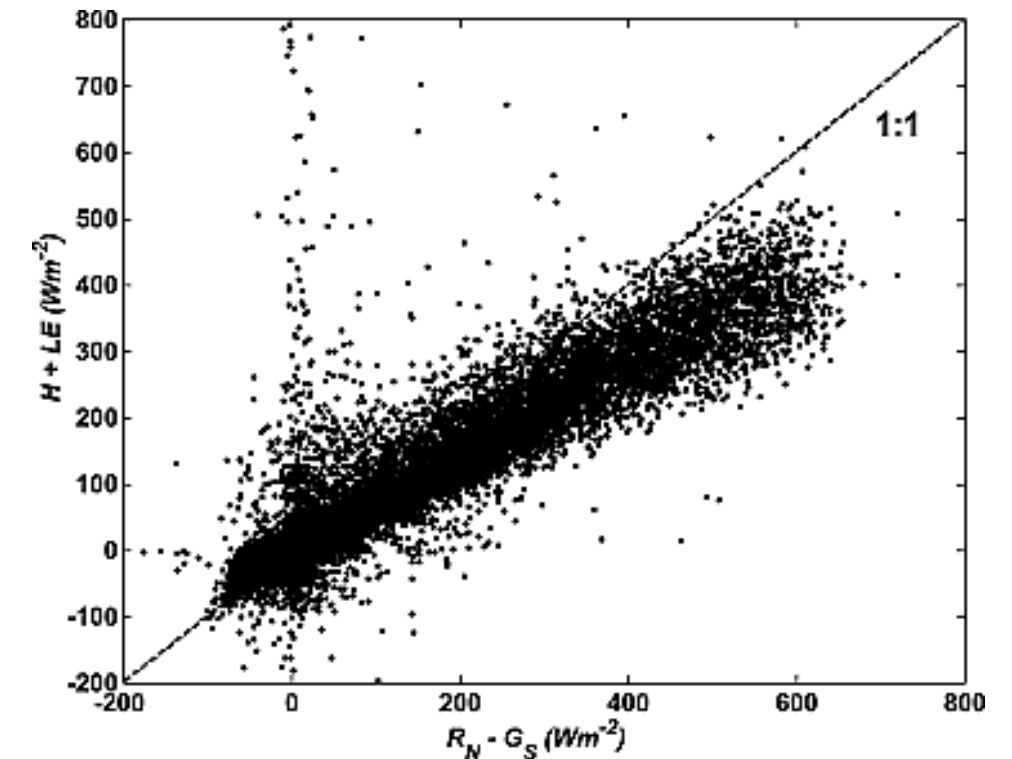
Ideal closure is represented by a slope of 1 and an intercept of 0.

Measured by
the **Biomet**
System

If not ideal:

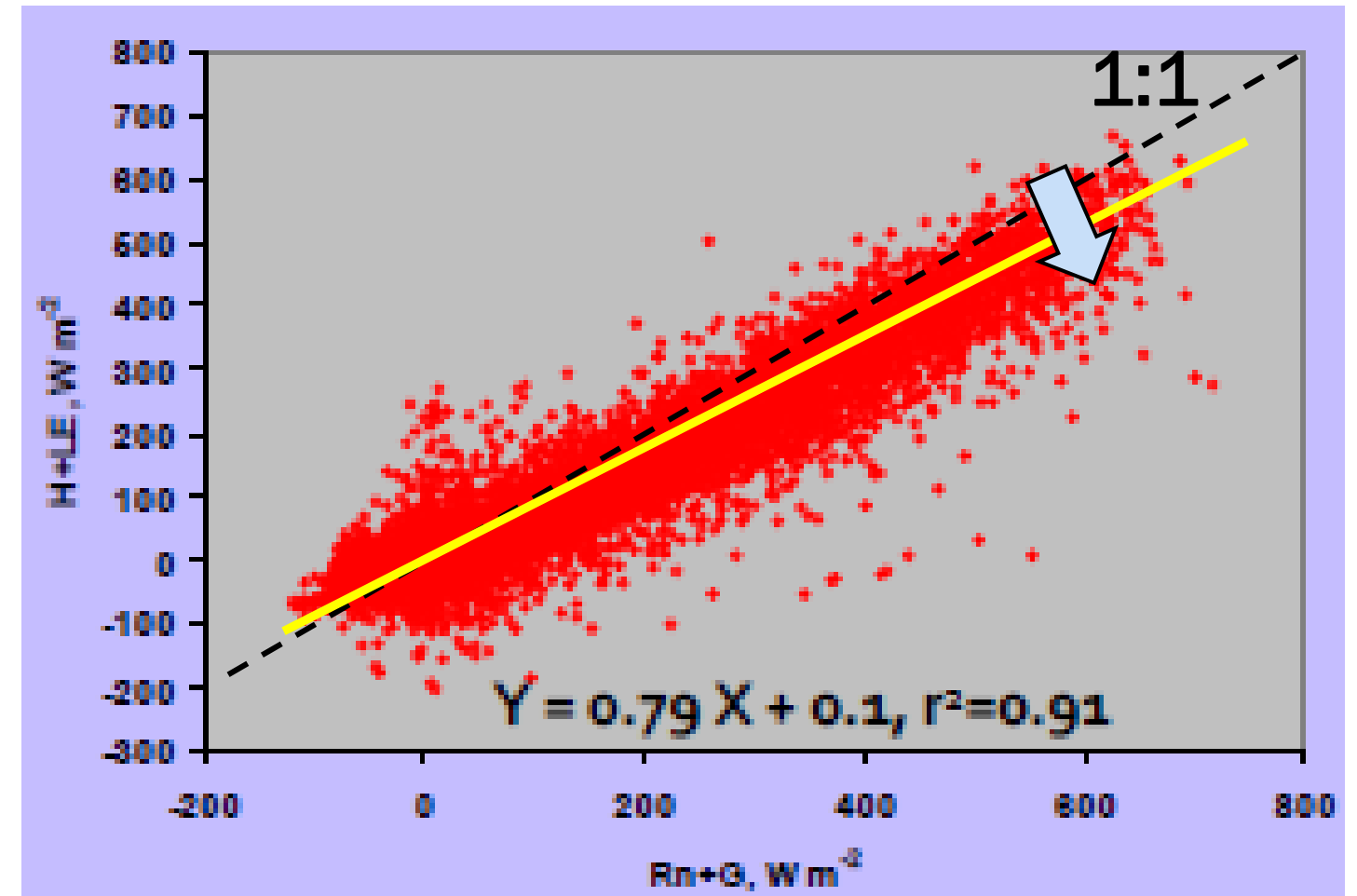
- Sampling errors?
- Systematic biases?
- Neglected energy sinks?
- Other?

Realistic (measured) closure



What are typical closure results for Eddy Covariance sites?

- From many studies (i.e., FLUXNET), surface energy fluxes (**LE + H**) are frequently underestimated by about 10-to-30% relative to estimates of available energy flux (**Rn - G - S**).
- *Why is this?*



Probably causes for this imbalance

| Energy component | Cause of imbalance | Examples |
|------------------|-------------------------|--------------------------------|
| Rn, G, H, LE | Sampling | Source areas differ |
| | Instrument bias | Net radiometer biased |
| Rn, G | Neglected energy sinks | Storage above soil heat plates |
| H, LE | High/low frequency loss | Sensor separation/large eddies |
| | Advection | Regional circulation |

How Sampling could cause an imbalance

Cause of imbalance

Examples

Sampling

Source areas differ

Instrument bias

Net radiometer biased

Neglected energy sinks

Storage above soil heat plates

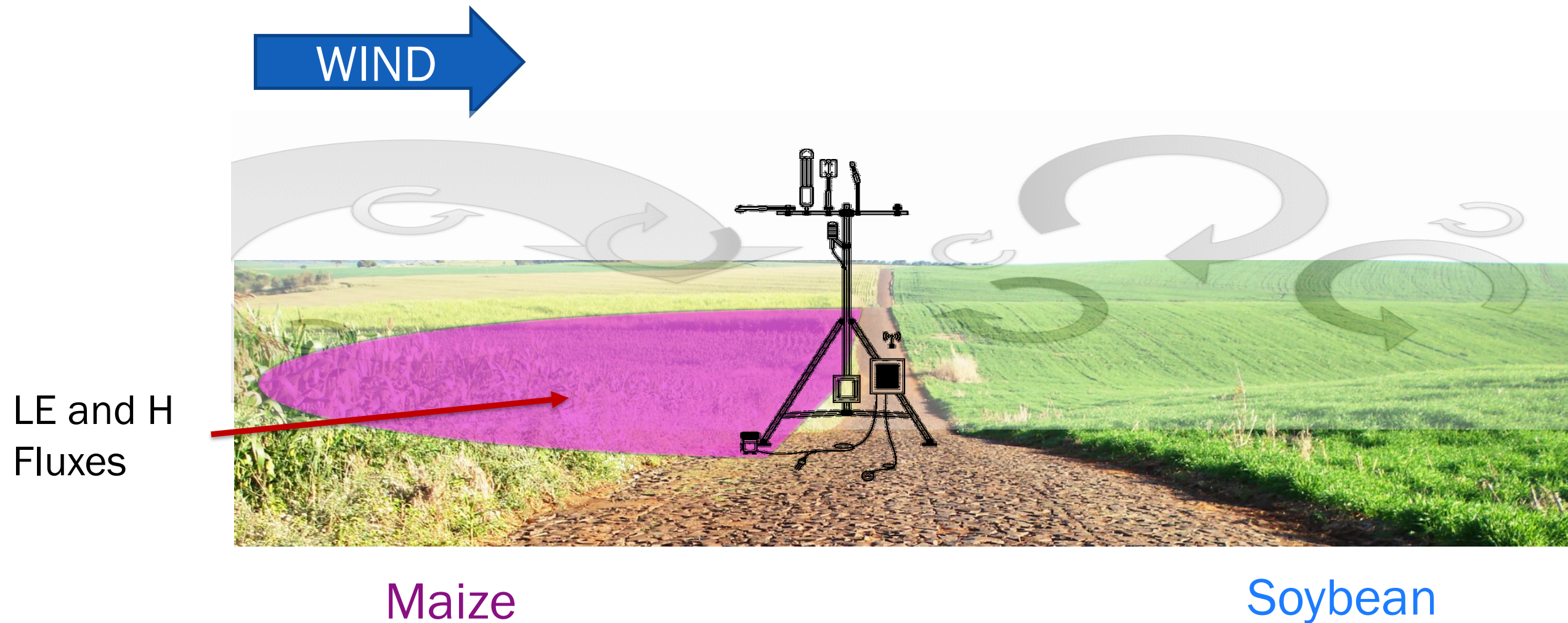
High/low frequency loss

Sensor separation/large eddies

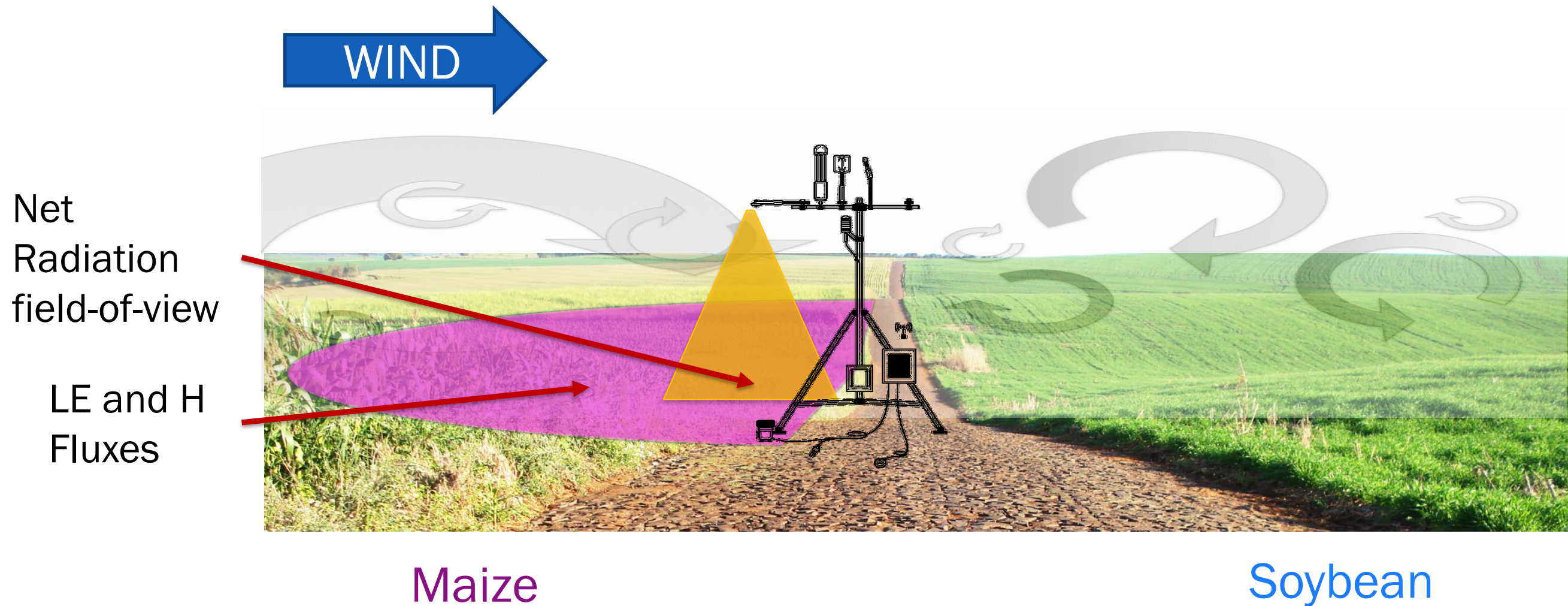
Advection

Regional circulation

One EC System between two different plots

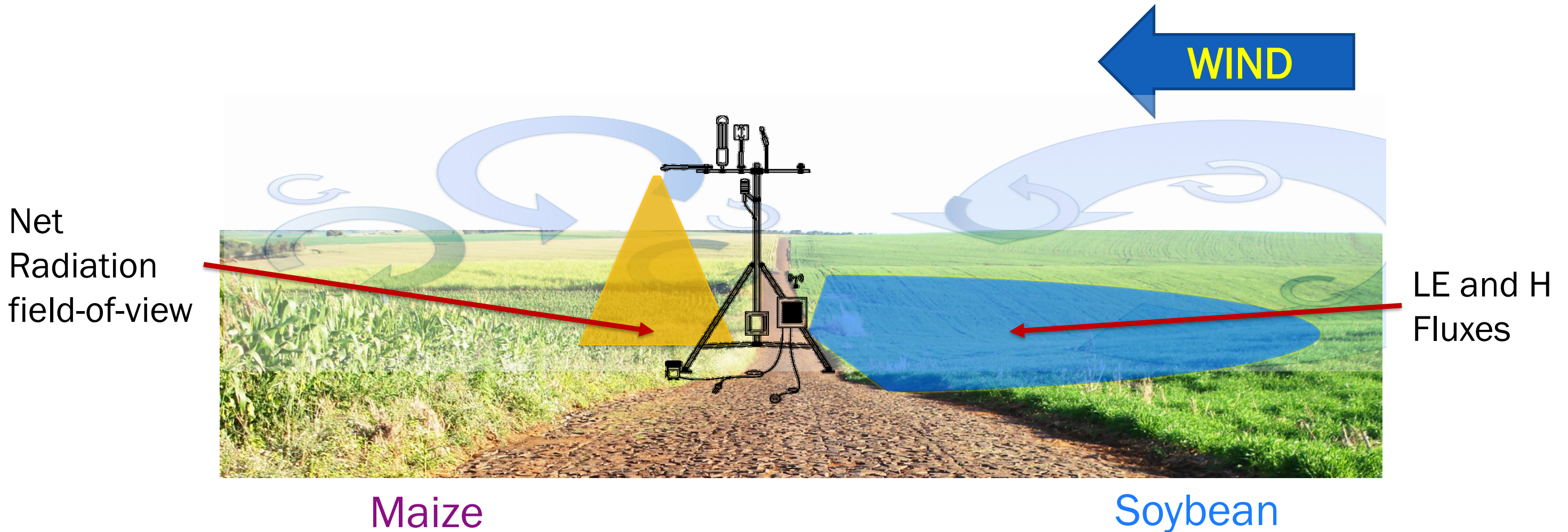


When Source Areas are the same...



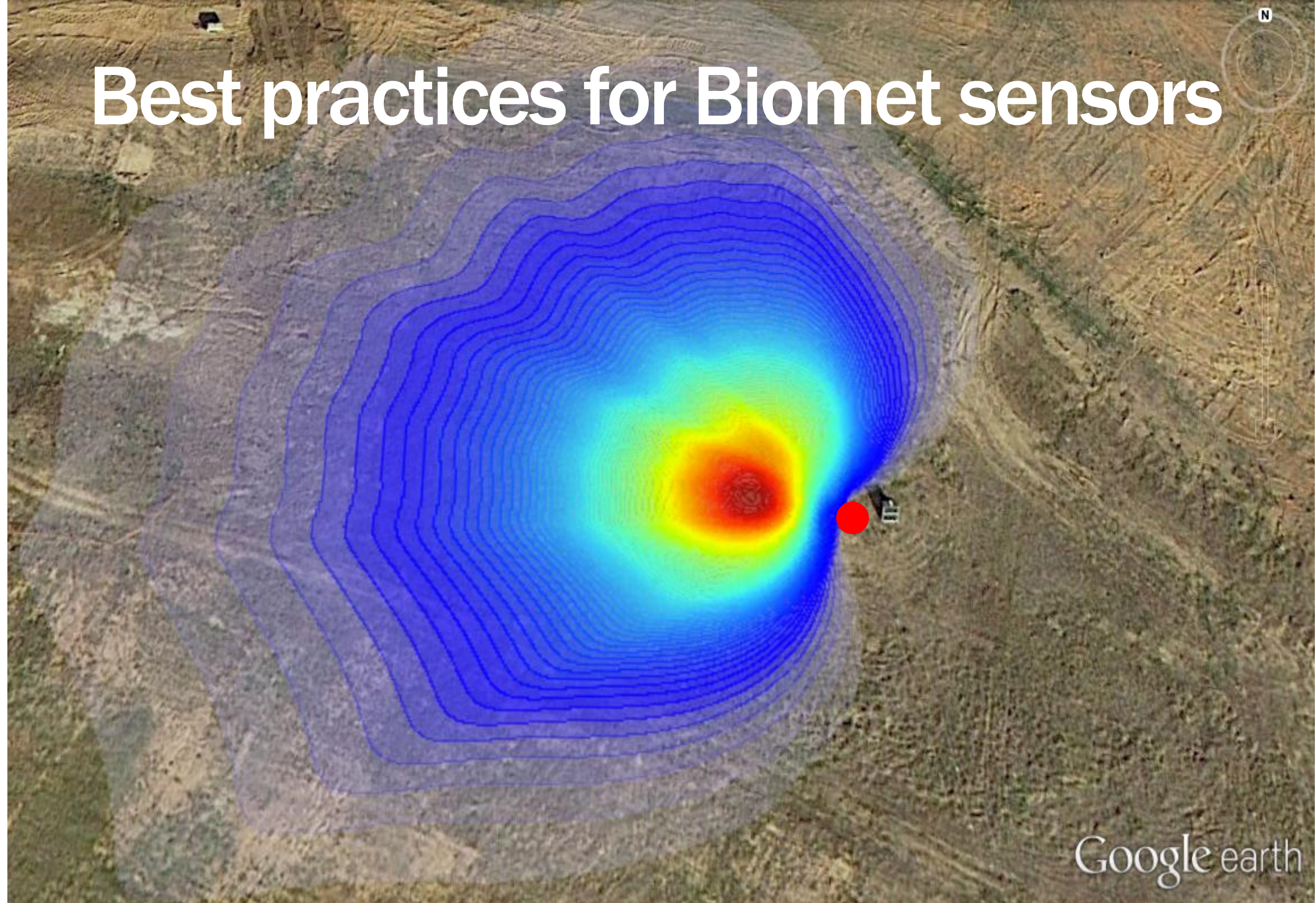
Energy measurements are from the same ecosystem

When Source Areas are different...



! Energy measurements are from the different ecosystems

Best practices for Biomet sensors



How Biases could cause an imbalance

Cause of imbalance

Examples

Sampling

Source areas differ

Instrument bias

Net radiometer biased

Neglected energy sinks

Storage above soil heat plates

High/low frequency loss

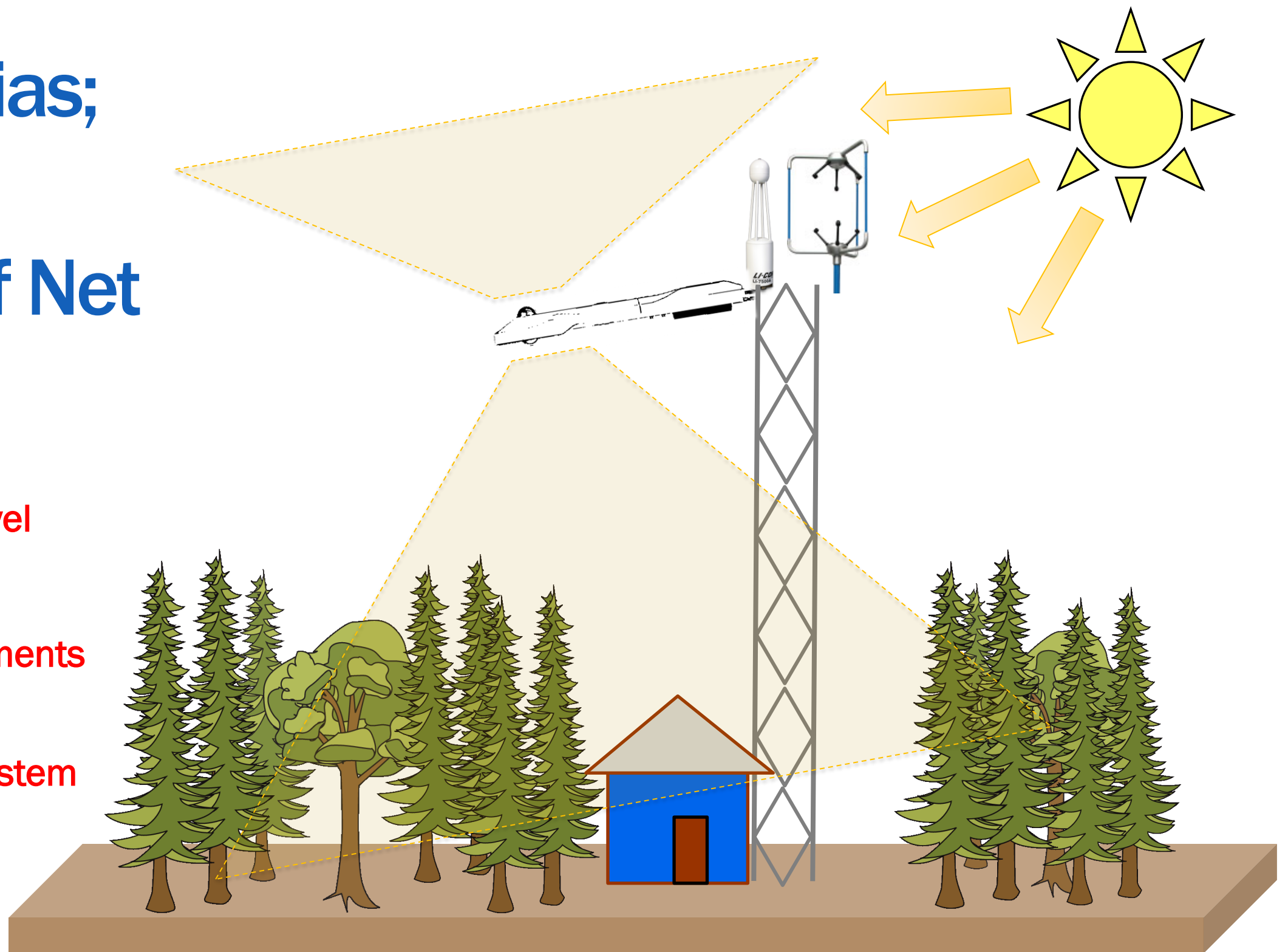
Sensor separation/large eddies

Advection

Regional circulation

Instrument bias; improper installation of Net Radiometer

- ! Radiometer is not level
- ! Radiometer can be shaded by EC instruments
- ! Radiometer is not measuring the ecosystem
- ! Radiometer is measuring the tower

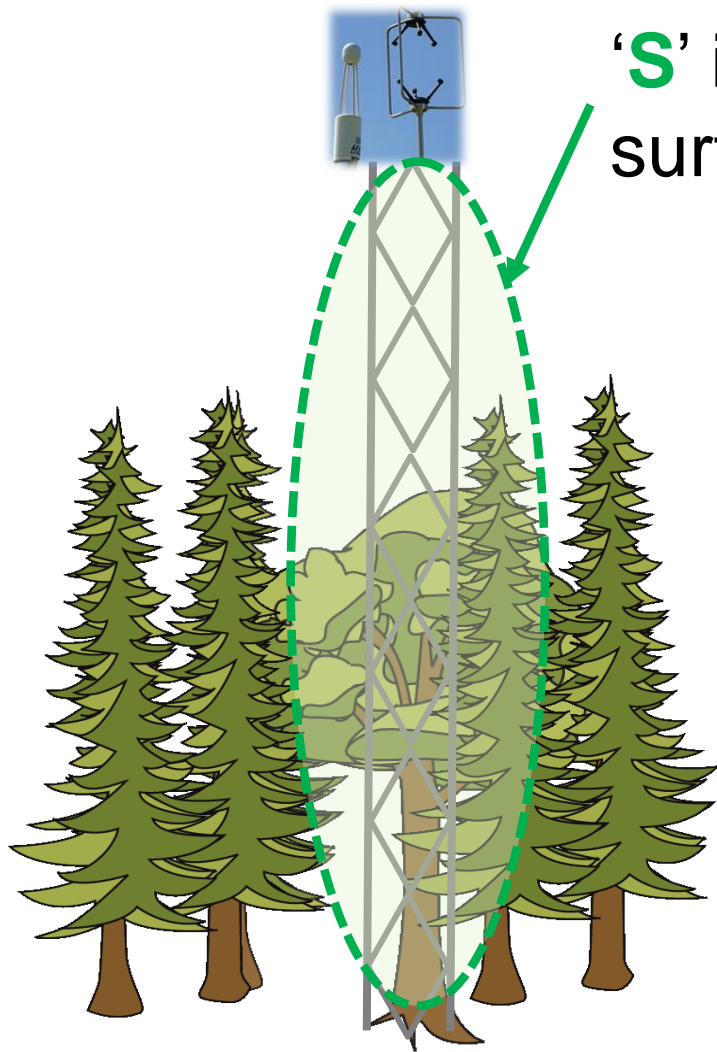


How neglecting energy sinks could cause an imbalance

| Cause of imbalance | Examples |
|-------------------------|--------------------------------|
| Sampling | Source areas differ |
| Instrument bias | Net radiometer biased |
| Neglected energy sinks | Storage above soil heat plates |
| High/low frequency loss | Sensor separation/large eddies |
| Advection | Regional circulation |

Heat energy is stored in the (tall) canopy

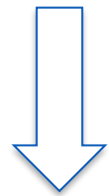
- For tall vegetation sites ($h > 8\text{m}$)



'S' is the rate of change of heat storage between the soil surface and the level of the eddy covariance instrumentation

If we add 'S' back into the Energy Balance Eqn:

$$R_n = H + LE + G + S + Q$$

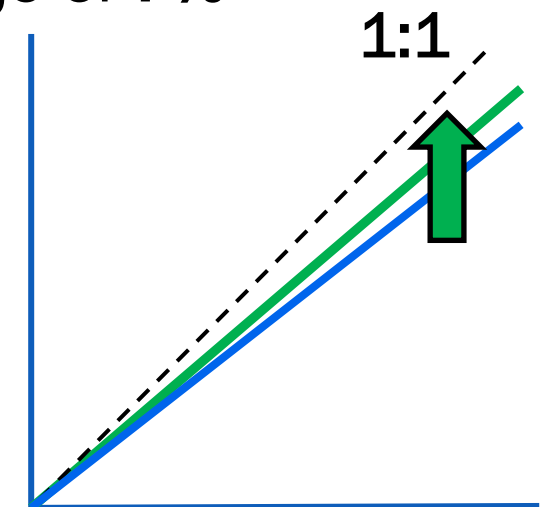


$$R_n - G - S \approx H + LE$$



Tall forested sites should measure S.

Based on 26 site-years of data, including 'S' for tall sites increased the slope by an average of 7%

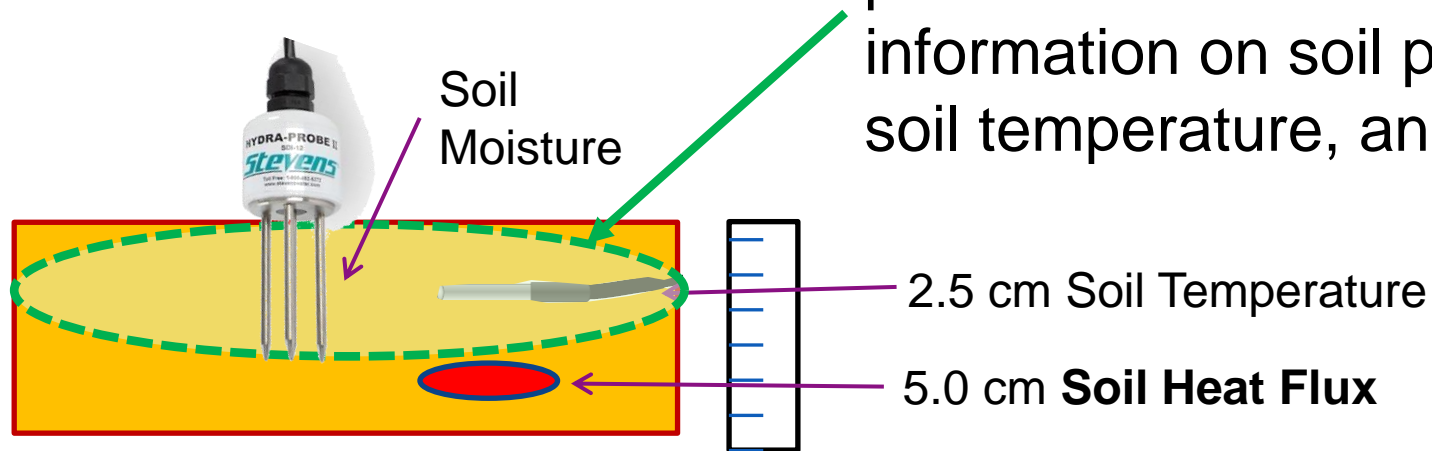


Heat Energy is also stored in the Soil

- We can estimate Heat Storage in the Soil (between Heat flux plates and surface)

Heat stored '**S**' above heat flux plates can be estimated using information on soil properties, soil temperature, and moisture.

Including the soil heat storage '**S**' increases the average slope by about **20%** for grasslands and agricultural sites



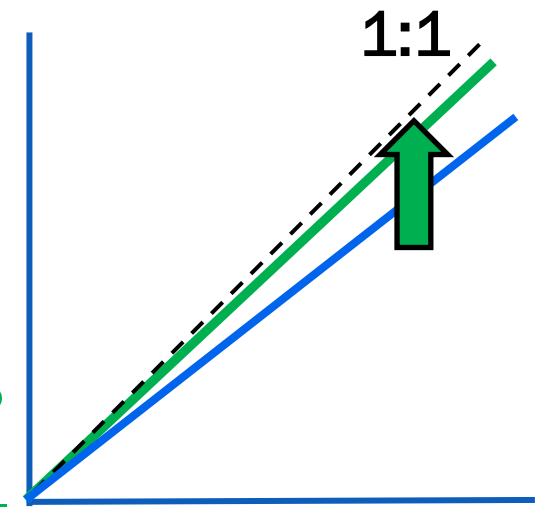
Soil Heat Flux at Surface = Measured Soil Heat Flux + Storage Term (**S**)

If we add '**S**' back into the Energy Balance Eqn:

$$R_n = H + LE + G + \mathbf{S} + Q$$

$$\Rightarrow R_n - G - \mathbf{S} \approx H + LE$$

Short canopy sites should measure **S**.



Soil temperature sensors - Soil thermistor



LI-COR
7900-180
Soil Thermistor



Soil thermistor - Installation

Minimum of 3 each:

- Soil variability
- Sun vs. Shade
- 5 m apart

Installation:

- Typically, 5 cm
- Be sure each sensor is completely covered with soil, no air pockets
- Bury a short length of the cable to prevent thermal conduction through wires
- Fill the hole with excavated soil

Thermistor
Heat Flux Plate



How losing high / low frequencies, and advection can cause an imbalance in the EB closure

Cause of imbalance

Examples

Sampling

Source areas differ

Instrument bias

Net radiometer biased

Neglected energy sinks

Storage above soil heat plates

High/low frequency loss

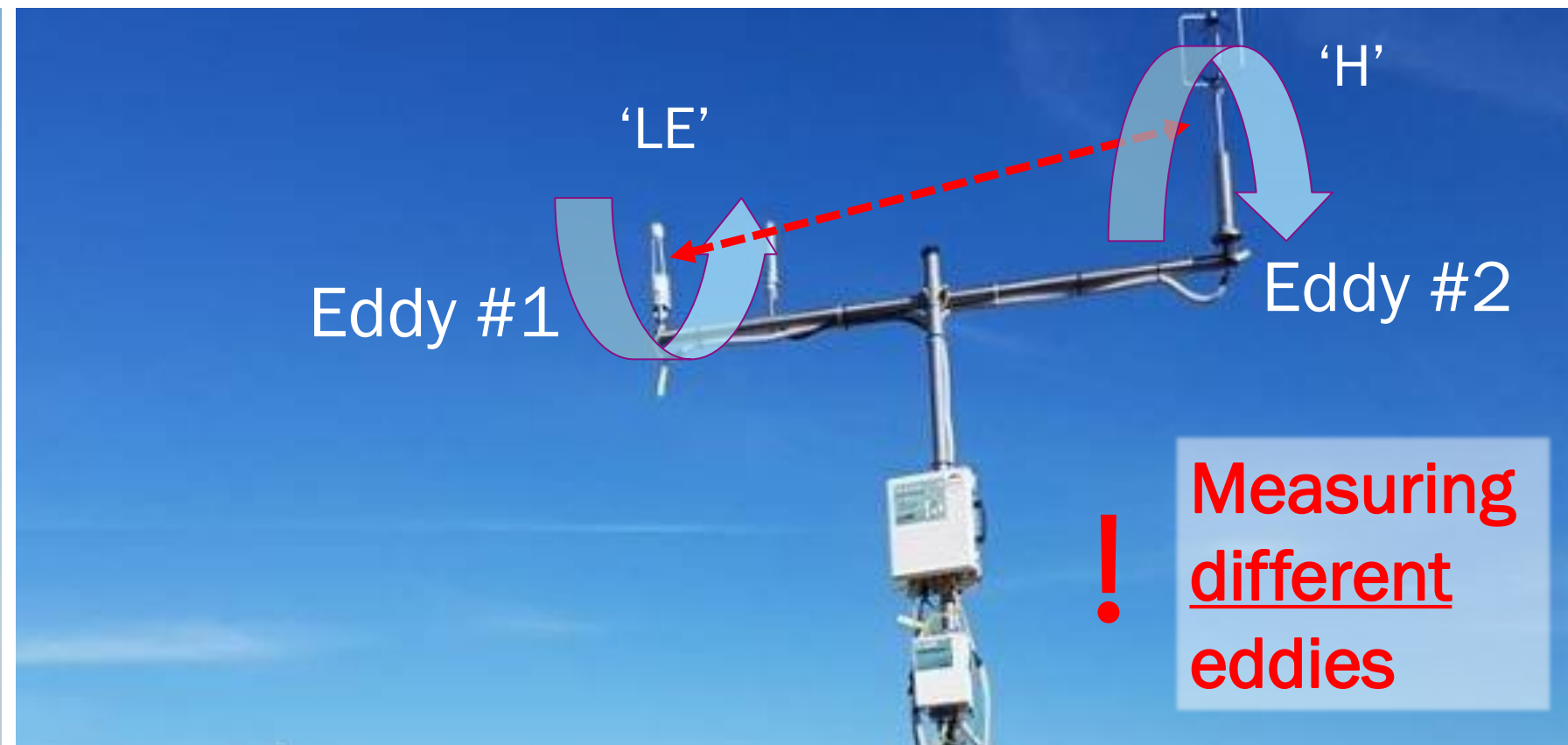
Sensor separation/large eddies

Advection

Regional circulation

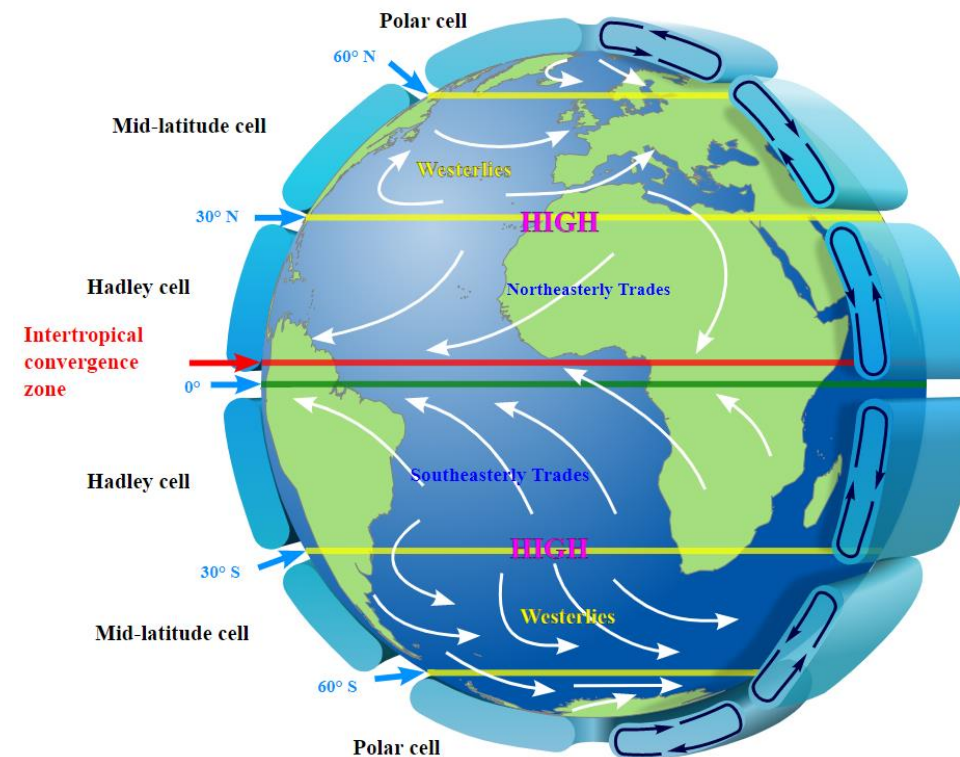
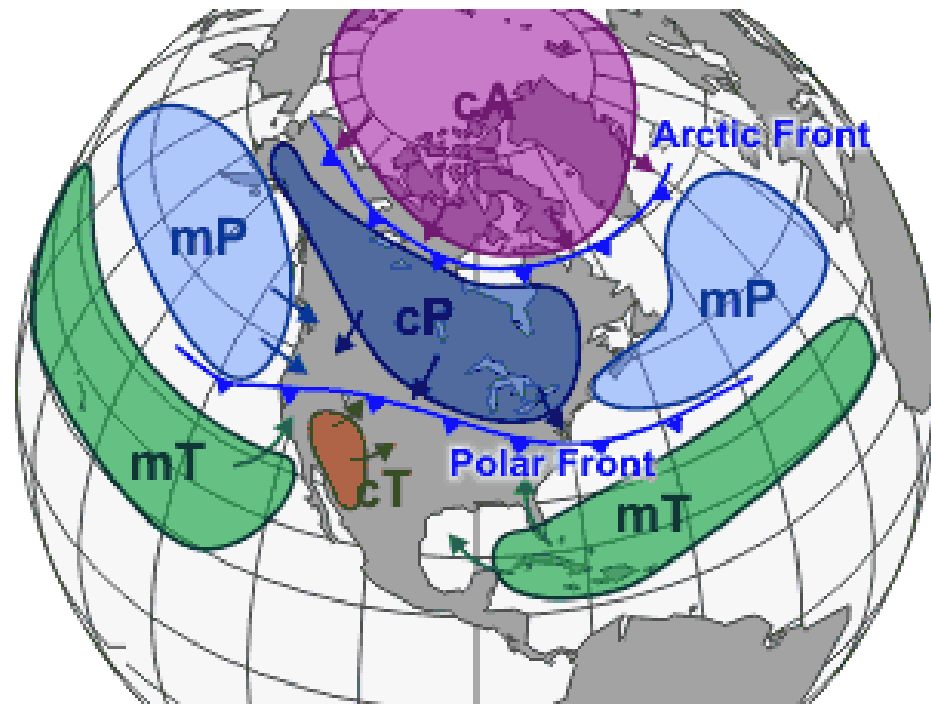
Improper sensor separation can cause the loss of high frequency energy measurements

- If separation is too big, H and LE are not from the same eddy and covariance is lost, creating an energy imbalance



Large, slow-moving structures can cause the loss of low frequency energy terms

- Large (synoptic) Scale, slow-moving structures transport portions of H and LE on scales longer than 30 minutes, creating residual energy terms



This can be corrected in post-processing of the data

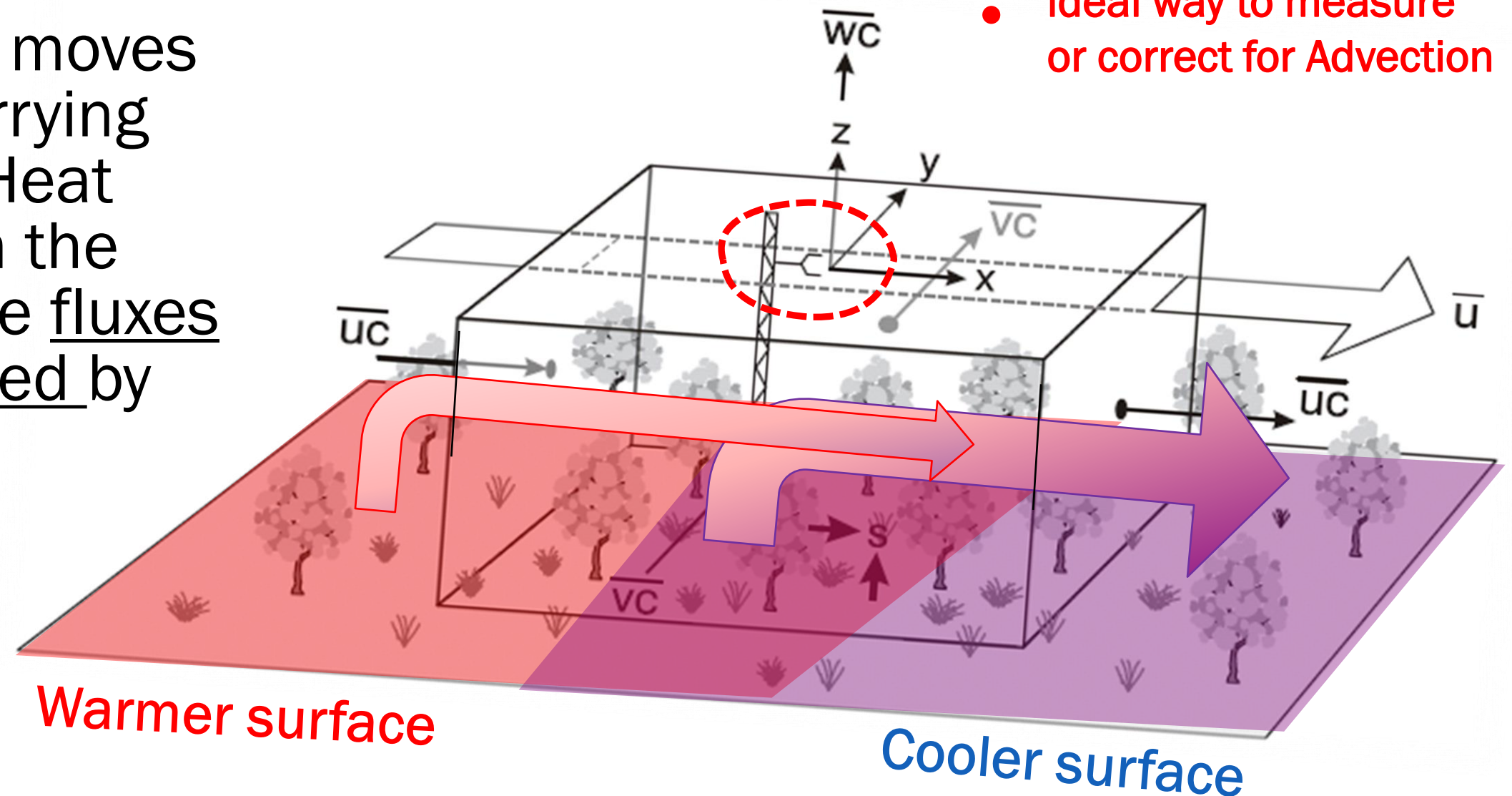
By The original uploader was Gopher backer at English Wikipedia. - Transferred from en.wikipedia to Commons by Undead_warrior., Public Domain, <https://commons.wikimedia.org/w/index.php?curid=34671644>

By Kaidor - Own work based on File:NASA depiction of earth global atmospheric circulation.jpg, CC BY-SA 3.0, <https://commons.wikimedia.org/w/index.php?curid=23902538>

How Advection can cause an imbalance in the energy balance closure

- Air mass slowly moves horizontally, carrying CO_2 , H_2O , and Heat Energy beneath the tower, and these fluxes are not measured by the EC System

! There is still not an ideal way to measure or correct for Advection



Summary – how can we obtain better Energy Balance closure for flux verification?

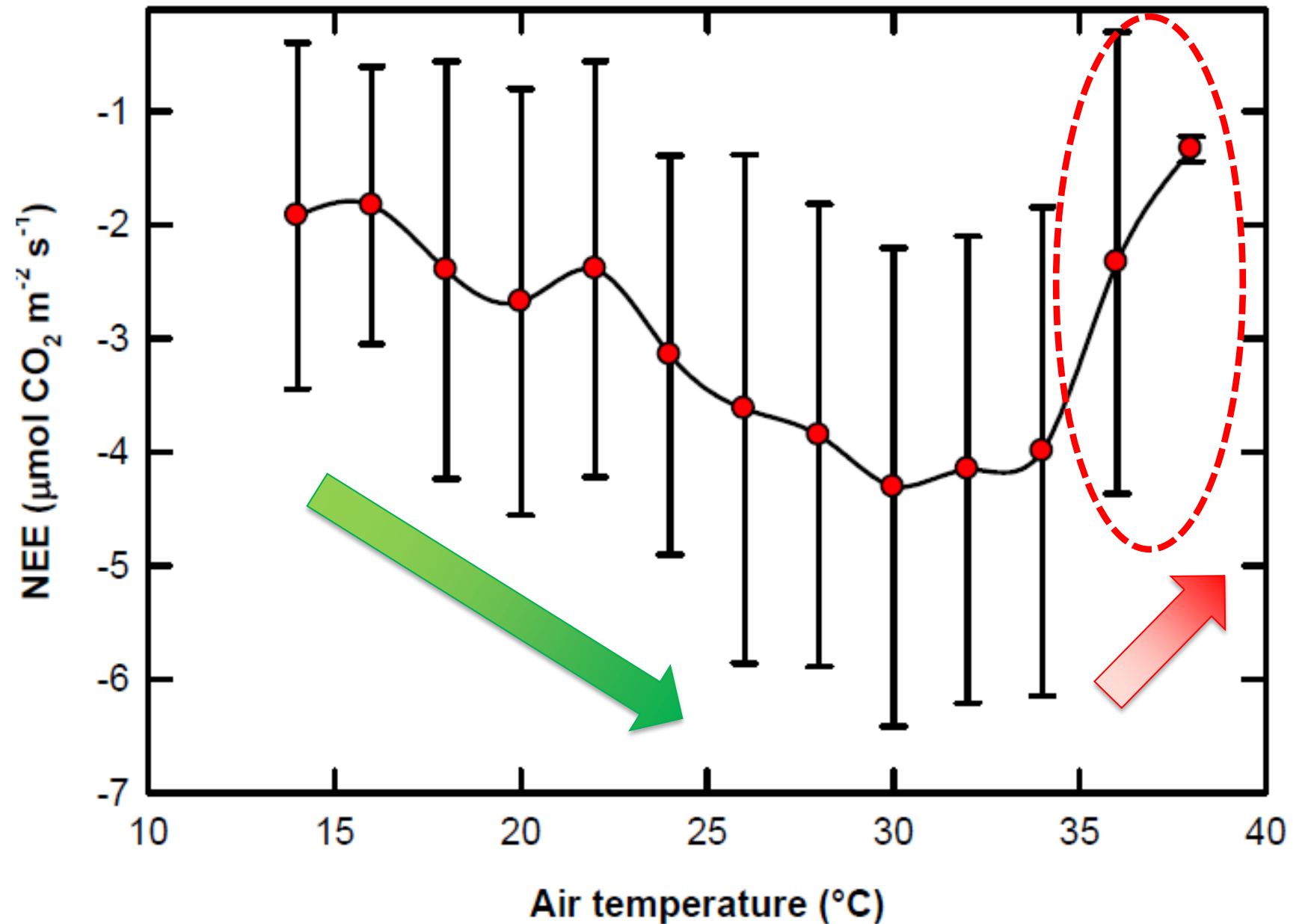
- Biomet Sensors can collect Energy Balance terms
- A lack of energy balance closure may indicate that CO₂ and H₂O flux estimates may be in error; however, it is not conclusive.
 - Errors in the Biomet measurements can give false errors of flux estimates.
 - Additional measurements (storage) may be needed
 - Biomet Sensors need to be installed correctly
- In general, Biomet variables and eddy covariance variables (H and LE) together can be used to verify CO₂ and H₂O measurements and subsequent computed fluxes.

Why collect Biomet measurements?

- Quality Assurance and Quality Checking (QA/QC)
 - Energy Balance closure.
- Recording weather helps to explain site behavior
 - The physical environment has profound effects on the biology as well as on the surface-atmosphere exchange.
- For Data Analysis
 - Gap filling – When instrumentation or power fails.
 - Partitioning – separating NEE into GPP and R_{ECO}
- Improving Fluxes

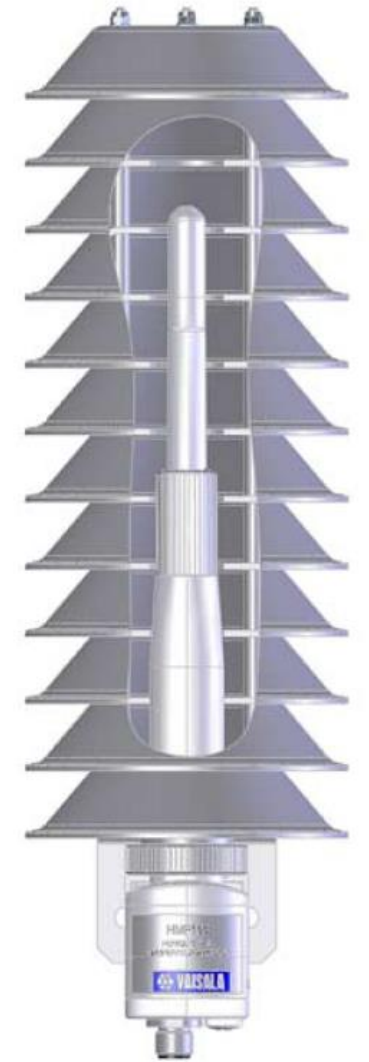
Example; how air temperature can affect fluxes

- We can see that air temperature can be a driver for fluxes



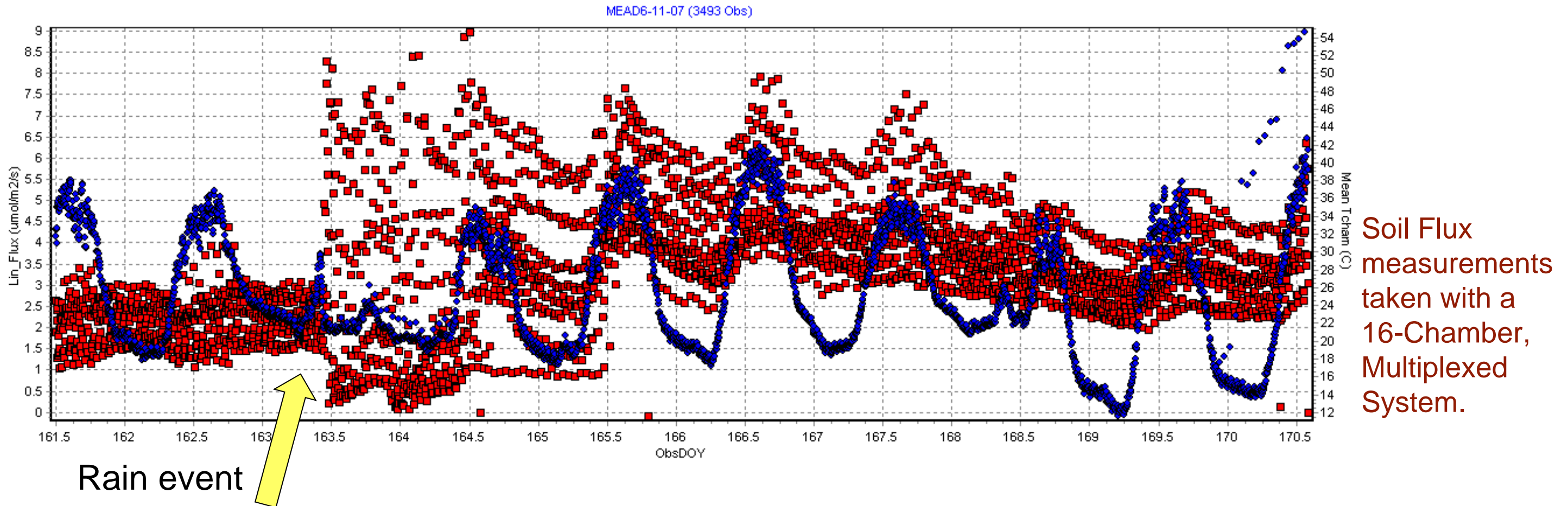
Measuring Air Temperature

Humidity and Temperature Probe
Vaisala HMP155 with RM Young Radiation Shield

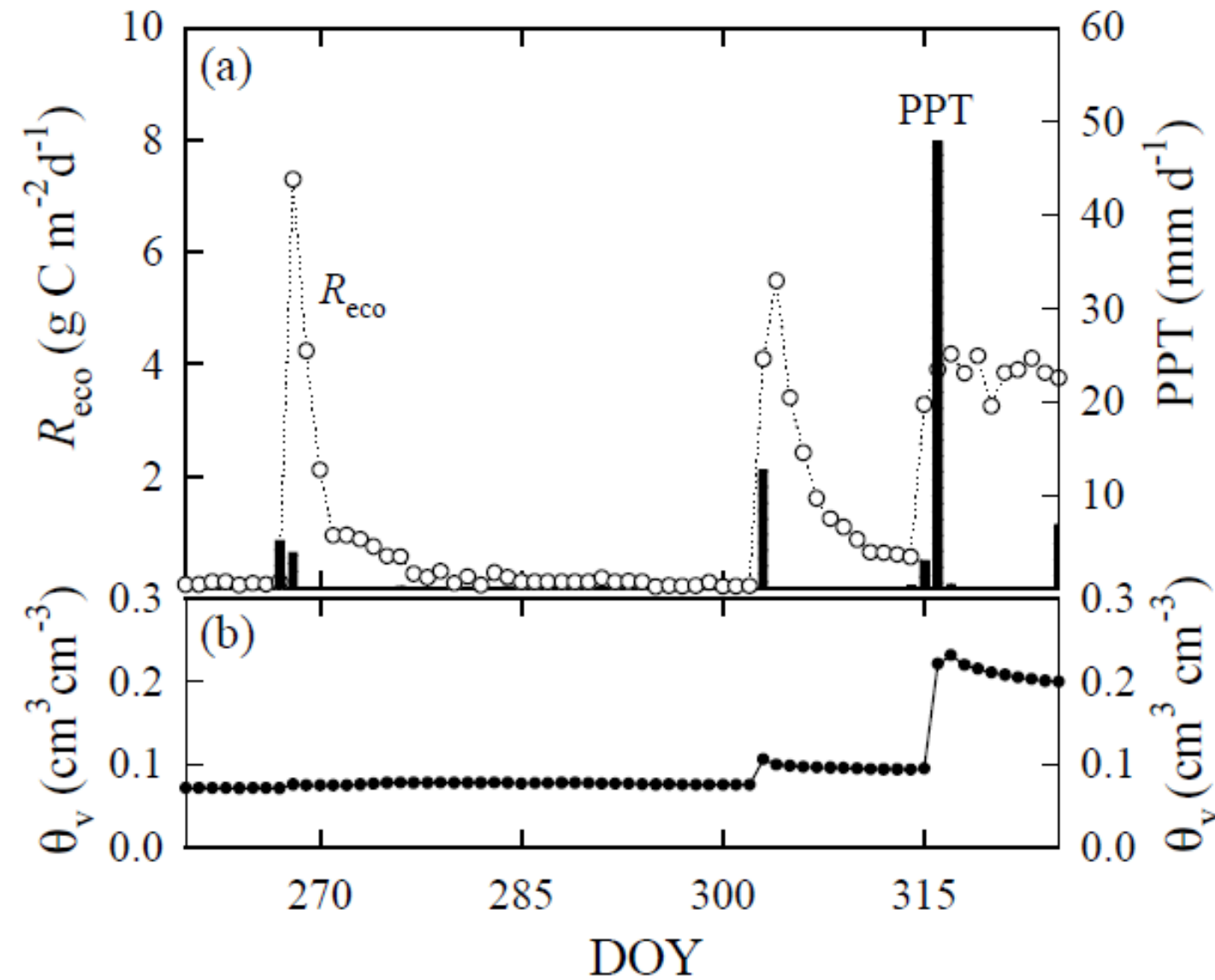


Example; how rainfall can affect fluxes

- We can see that CO₂ Soil efflux from the soil is dramatically altered after a rain event

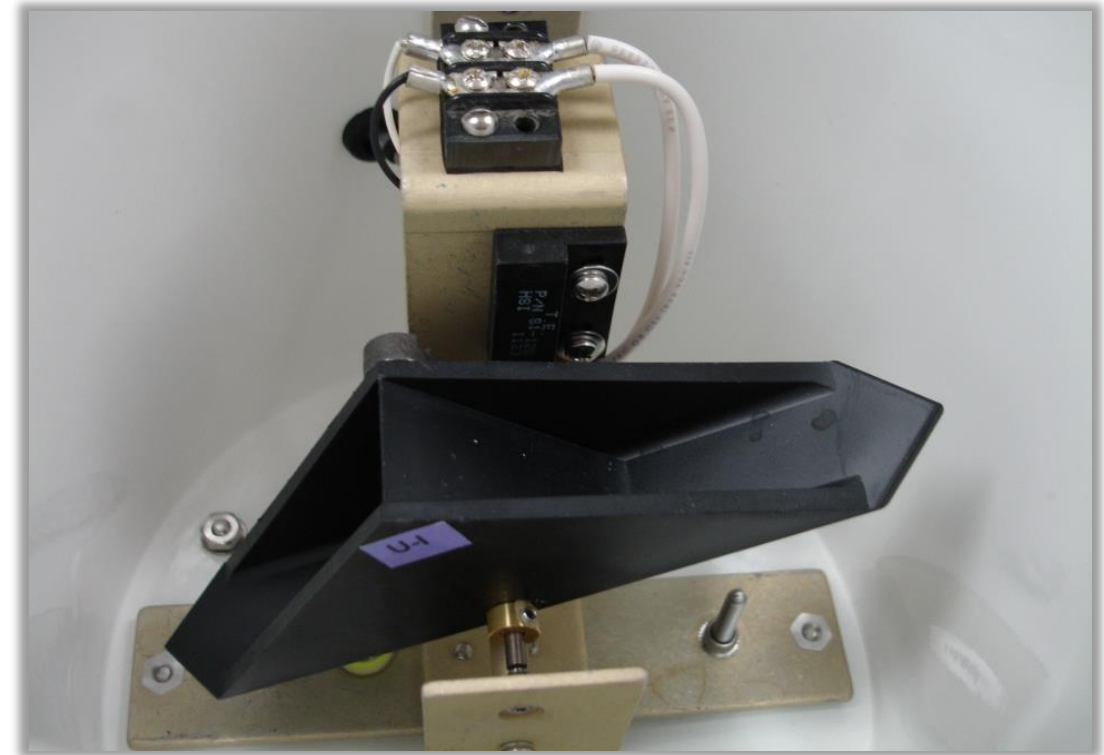


Example of long-term flux data - California grassland



Precipitation Gauges measure rain and/or snowfall

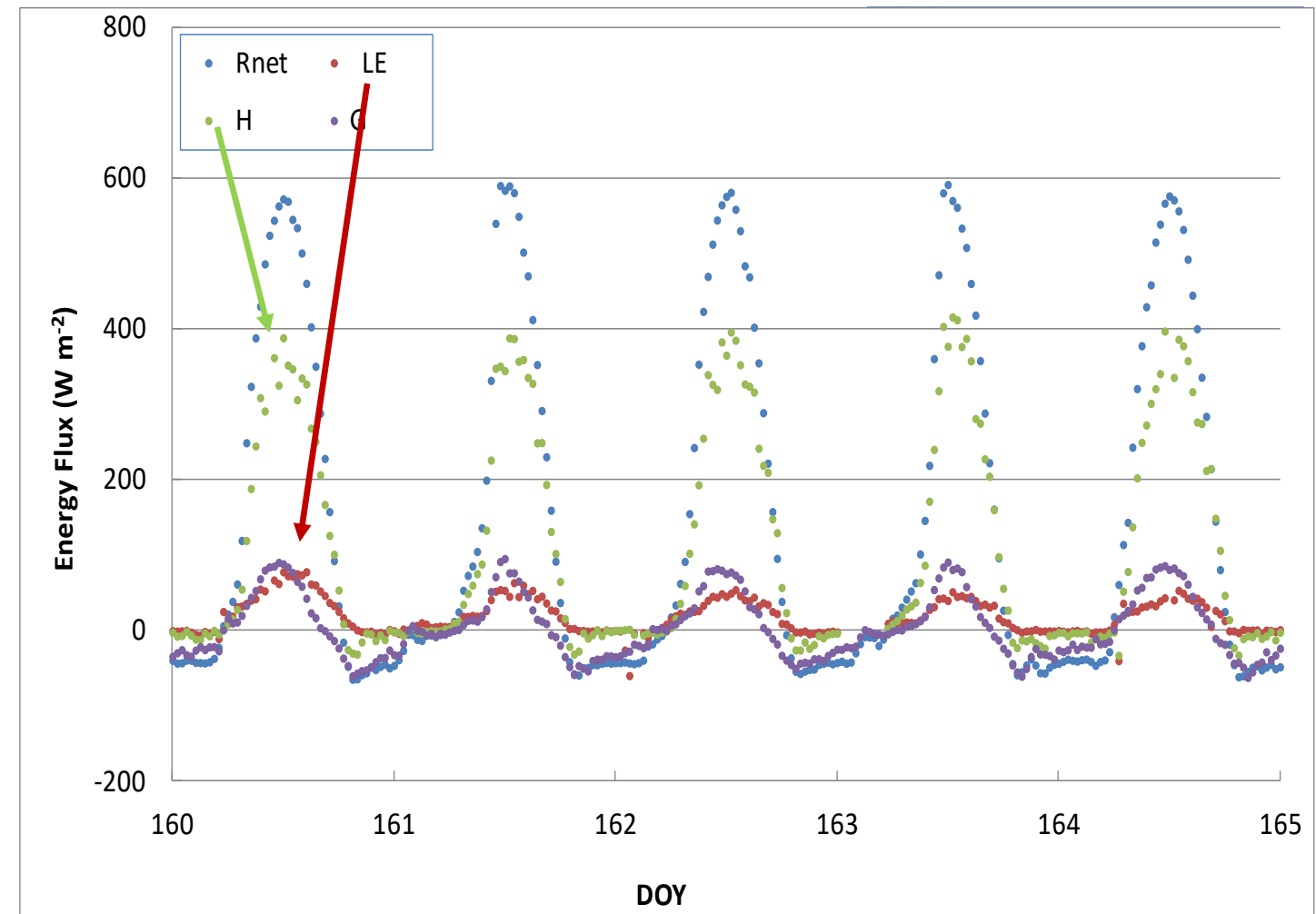
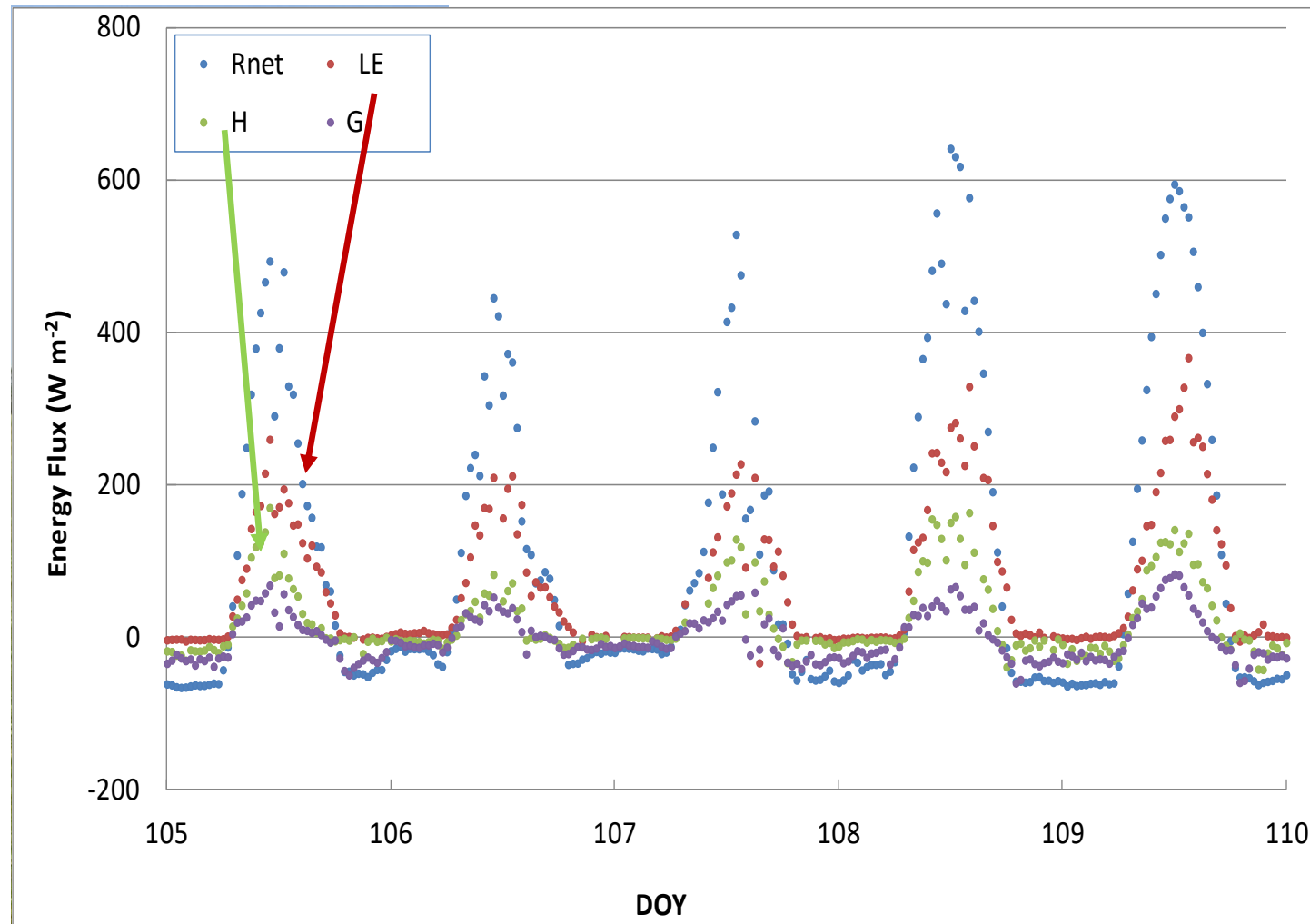
Texas Electronics
TRM25
Tipping Bucket Rain Gauge



Precipitation Gauge TR-525M Specifications:

| | |
|------------------------------|-------------------------------|
| Resolution: | 0.1 mm (0.004 in) |
| Accuracy: | 1.0% up to 50 mm/hr (2 in/hr) |
| Collector diameter: | 245 mm (9.66 in) |
| Operating Temperature Range: | 0 to 50° C |
| Switch: | Momentary potted reed |
| Switch Rating: | 30 VDC @ 2A |
| Switch Closure Time: | 135 ms |

Example, how soil moisture can affect fluxes



Spring

Energy partitioning depends on availability of soil moisture

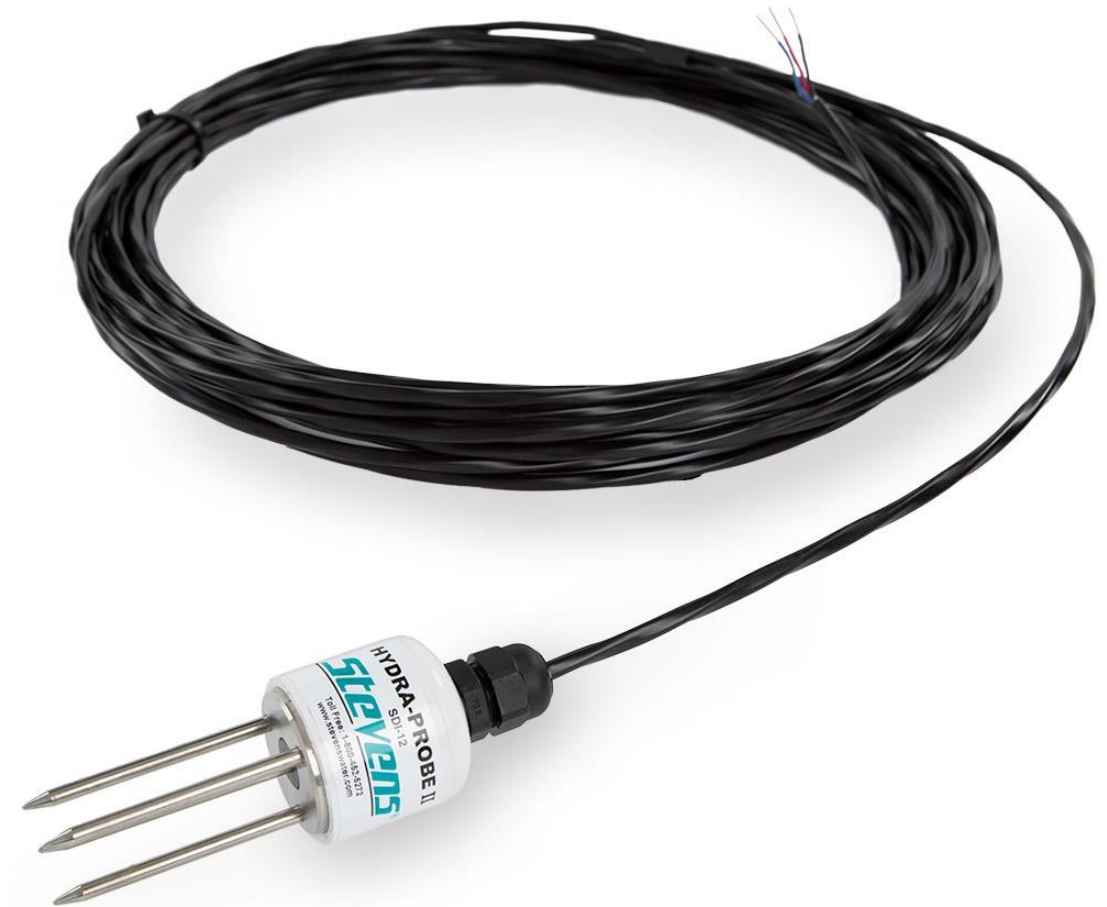
Summer



Soil moisture sensors

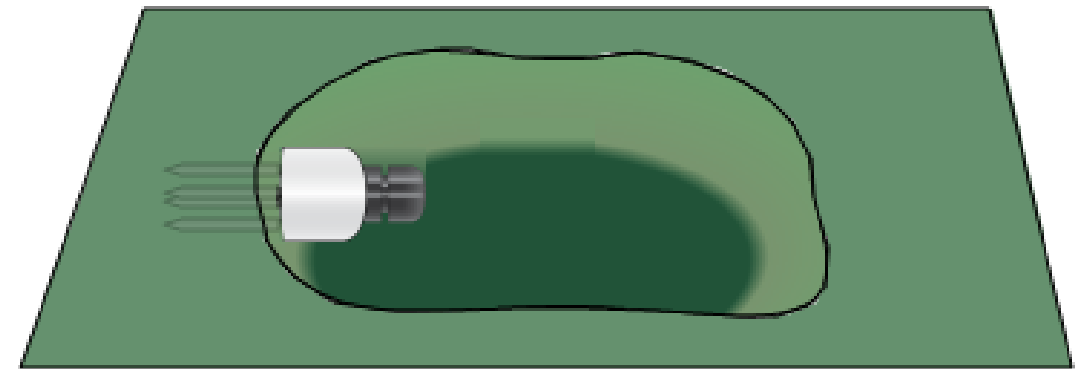
Steven's Hydra Probe II

- Soil Moisture
- Soil Temperature
- Soil Conductivity
- Salinity



Soil moisture sensor - Installation

- Due to spatial variations in soil, a minimum of 3 Probes are needed, more are better
- Press the probe into the soil until the rods are completely under the soil surface
- Air pockets around the rods will reduce the accuracy
- Be especially careful to avoid creating air pockets when re-inserting the probe into previously used holes



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 - Energy Balance closure.
- Recording weather helps to explain site behavior
 - The physical environment has profound effects on the biology as well as on the surface-atmosphere exchange.
- **For Data Analysis**
 - Gap filling – When instrumentation or power fails.
 - Partitioning – separating NEE into GPP and R_{ECO}
- Improving Fluxes

Filling data gaps in your flux measurements

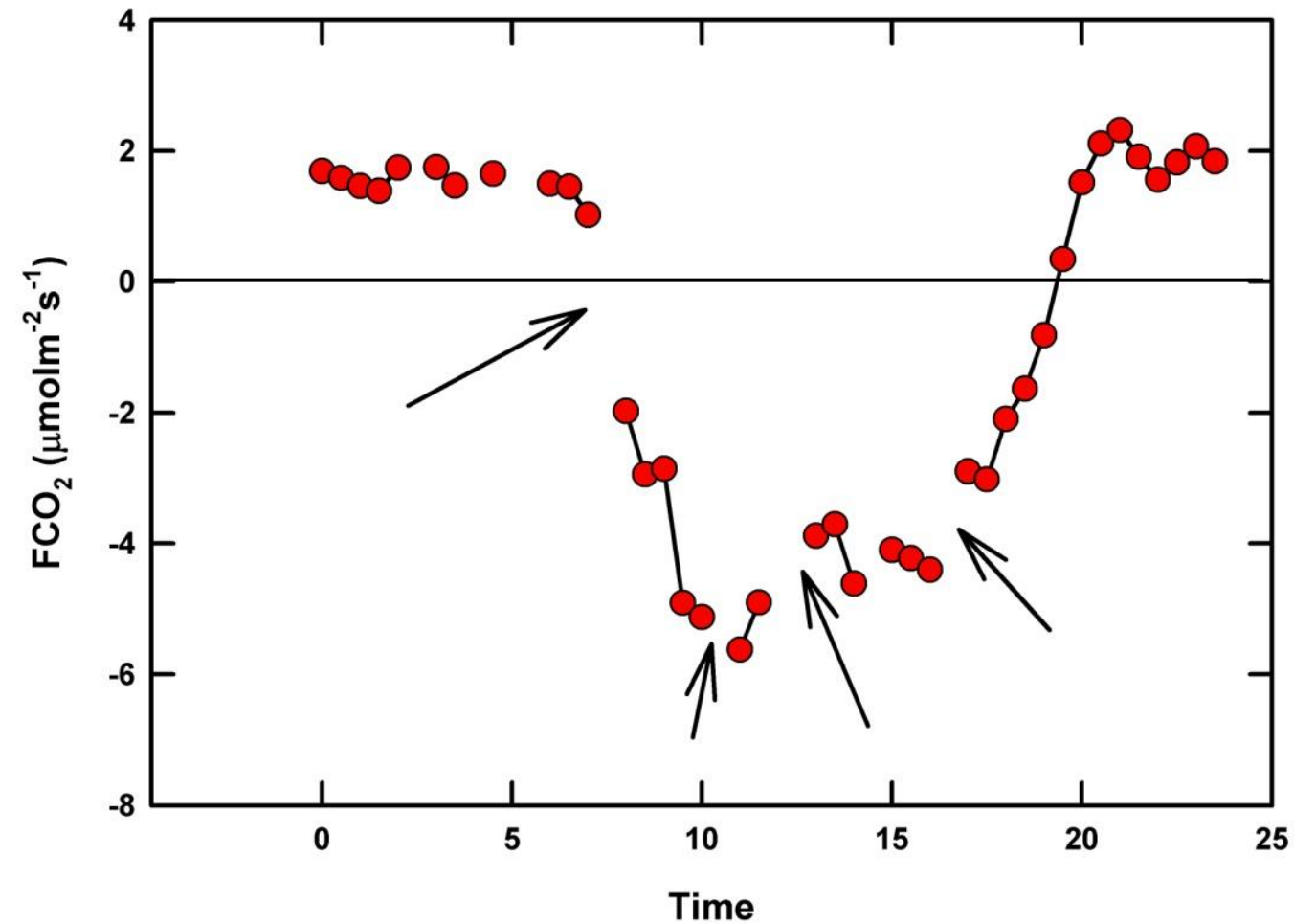
Gaps in the flux data occur due to:

- Sensor failure
- Power supply issues
- Data flagged for bad quality
- Spikes due to rain events
- Data flagged for low windspeed or turbulence

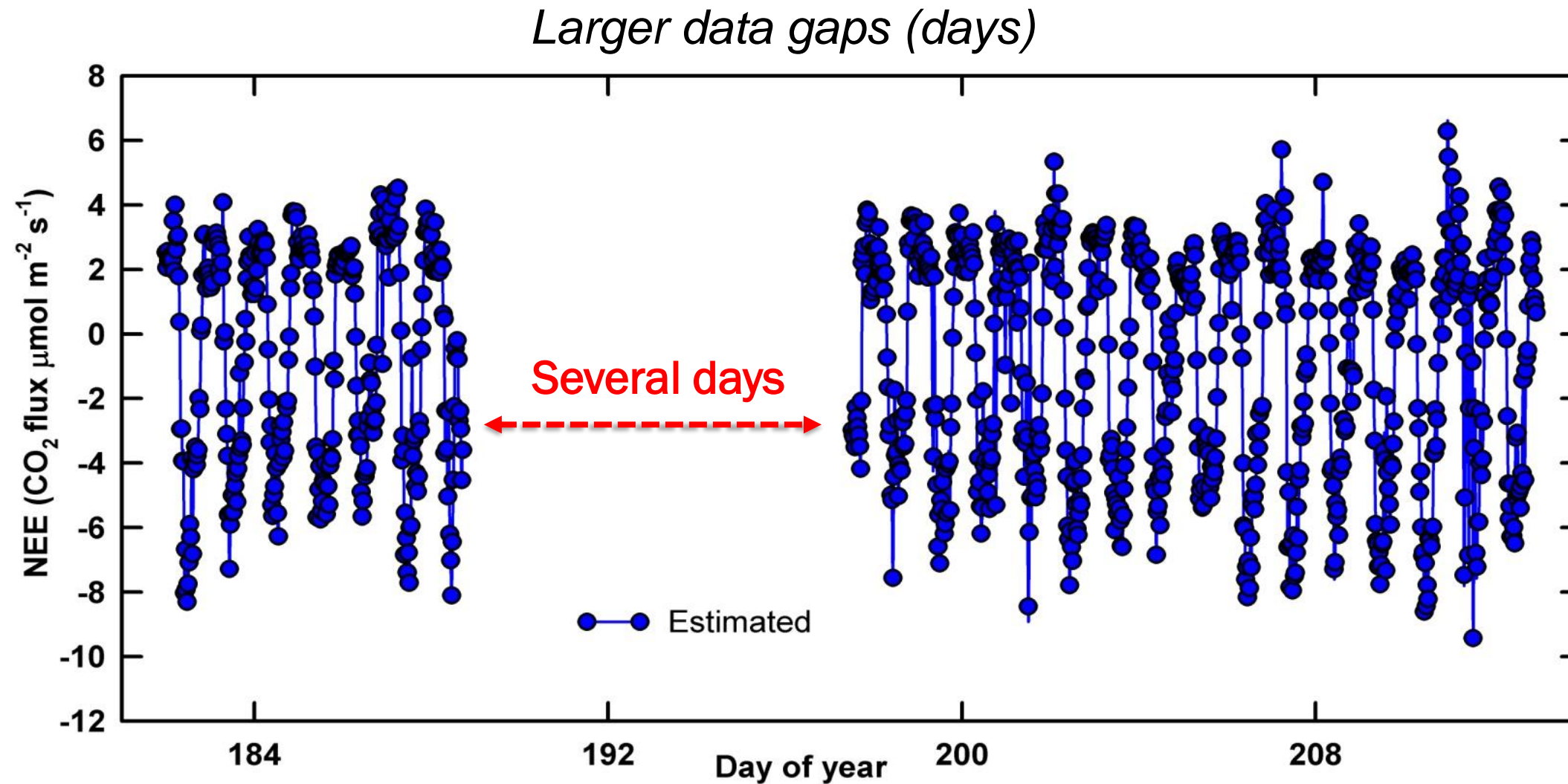


Smaller gaps can be filled using interpolation techniques

Smaller gaps (0.5 - 1 hour) in a diurnal curve



Filling data gaps in your flux measurements



! Larger gaps cannot be filled using interpolation



Larger gaps can be filled using other techniques

A few Flux Gap Filling techniques

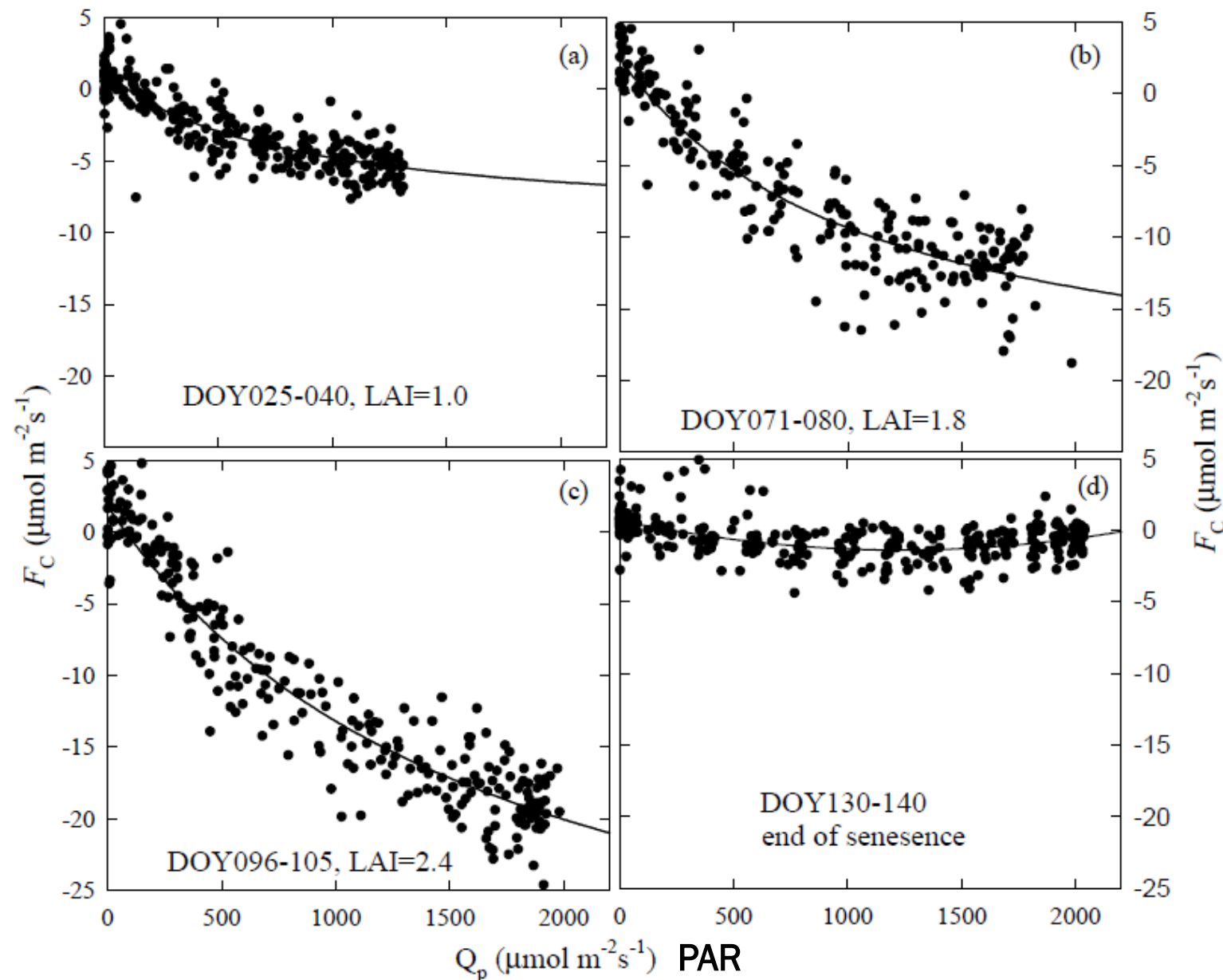
- Mean Diurnal Variation: Use data from similar days for gap filling
- Look-Up Tables: Multidimensional tables are created for gap filling
- Artificial Neural Networks: Empirical non-linear regression models
- Non-linear Regression: Models relating NEE to PAR and Respiration to Soil Temperature

*Examples using
Biomet variables:*

$$NEE = \left[\frac{a \times PAR}{a/b + PAR} \right] + c$$

$$R_e = R_{T_{ref}} \exp \left[\left(\frac{E_a}{T_{ref} \times R} \right) \times \left(1 - \frac{T_{ref}}{T_{soil}} \right) \right]$$

Example; gap filling using PAR as a driver for F_{CO_2}

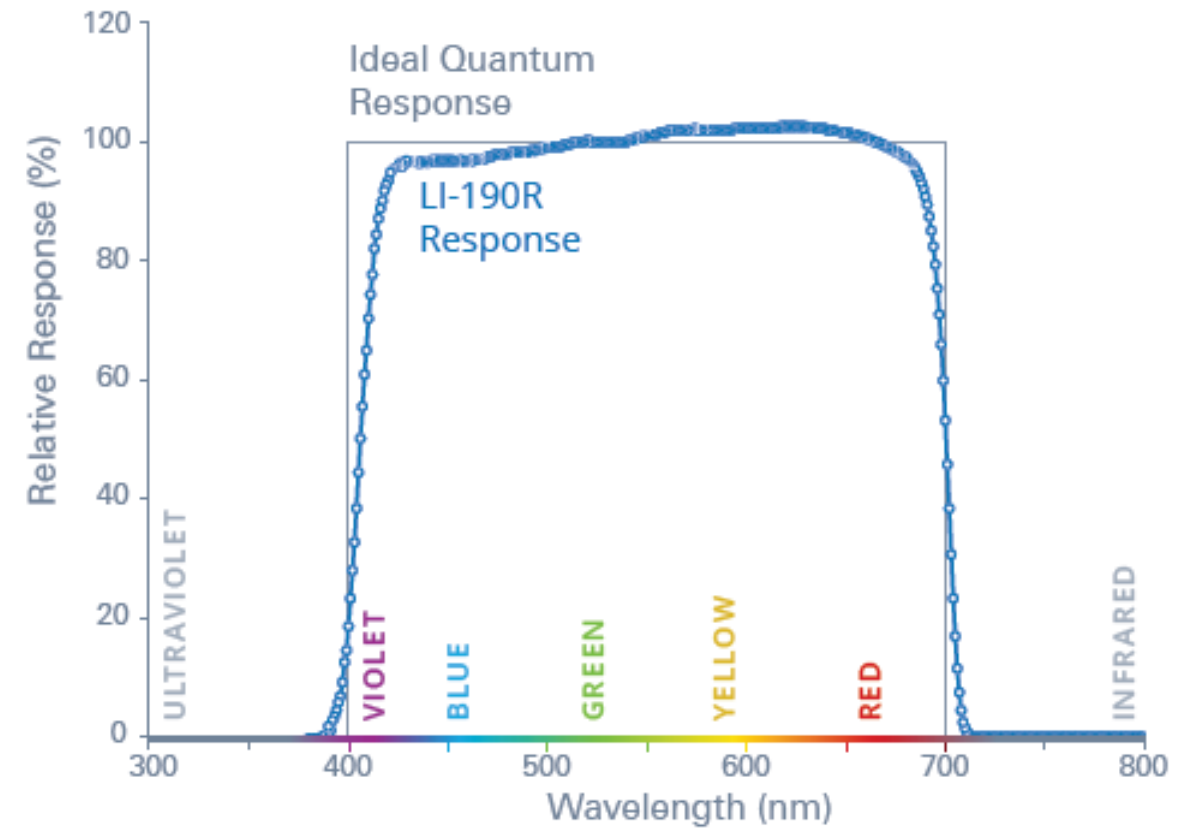


$$F_c = \frac{F_{max} \alpha PAR}{\alpha PAR + F_{max}} + R_{eco}$$



✓ Seasonal relationships between PAR and CO_2 flux

PAR - Quantum Sensor LI-190R



Typical values: 0 – 2000 $\mu\text{mol m}^{-2} \text{s}^{-1}$

PAR - Quantum Sensor LI-190R

Installation

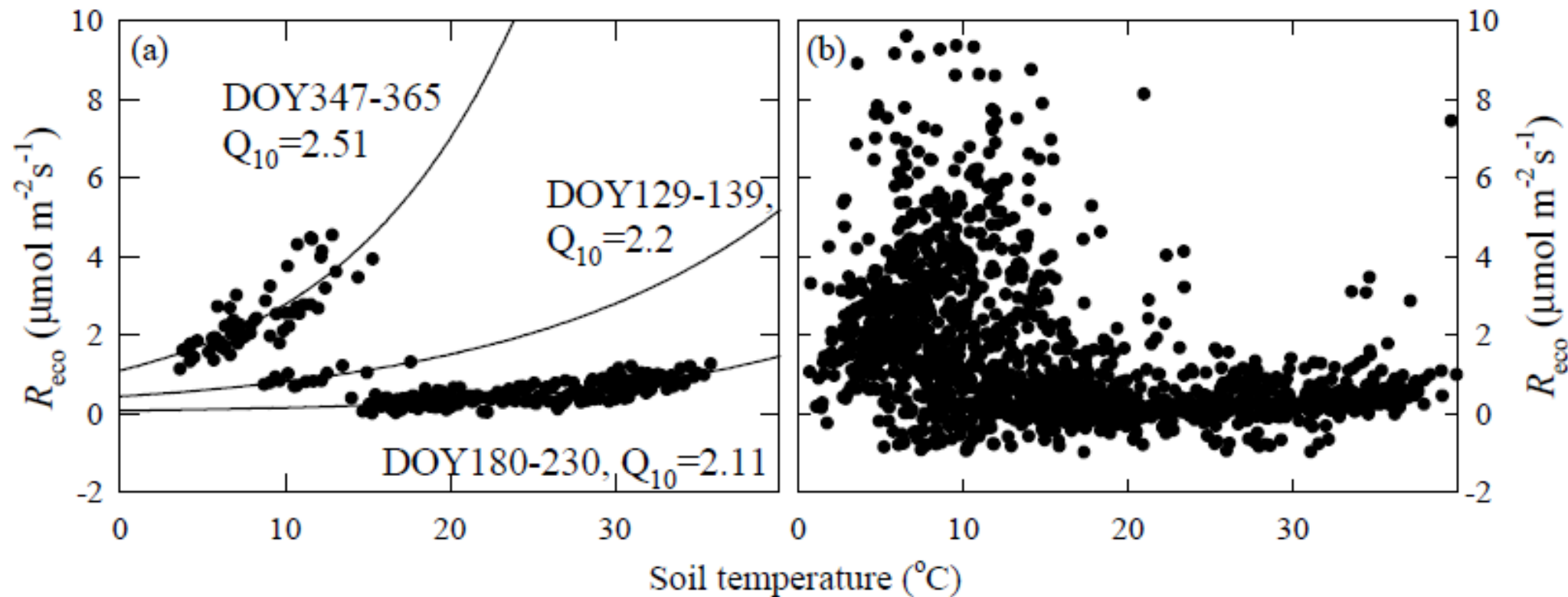
- Never under a shadow, either from the surrounding landscape elements or from the tower
- Mount the sensor on the tower to minimize reflected radiation that is visible to the sensor
- Mount leveled

Maintenance

- Keep domes, windows, and absorbers clean.
- Keep level.
- Recalibrate every two years.



Example; gap filling using Soil Temperature as a driver for Ecosystem Respiration



$$F_c = b_0 \exp(bT_{\text{soil}})$$

$$Q_{10} = \exp(10b)$$

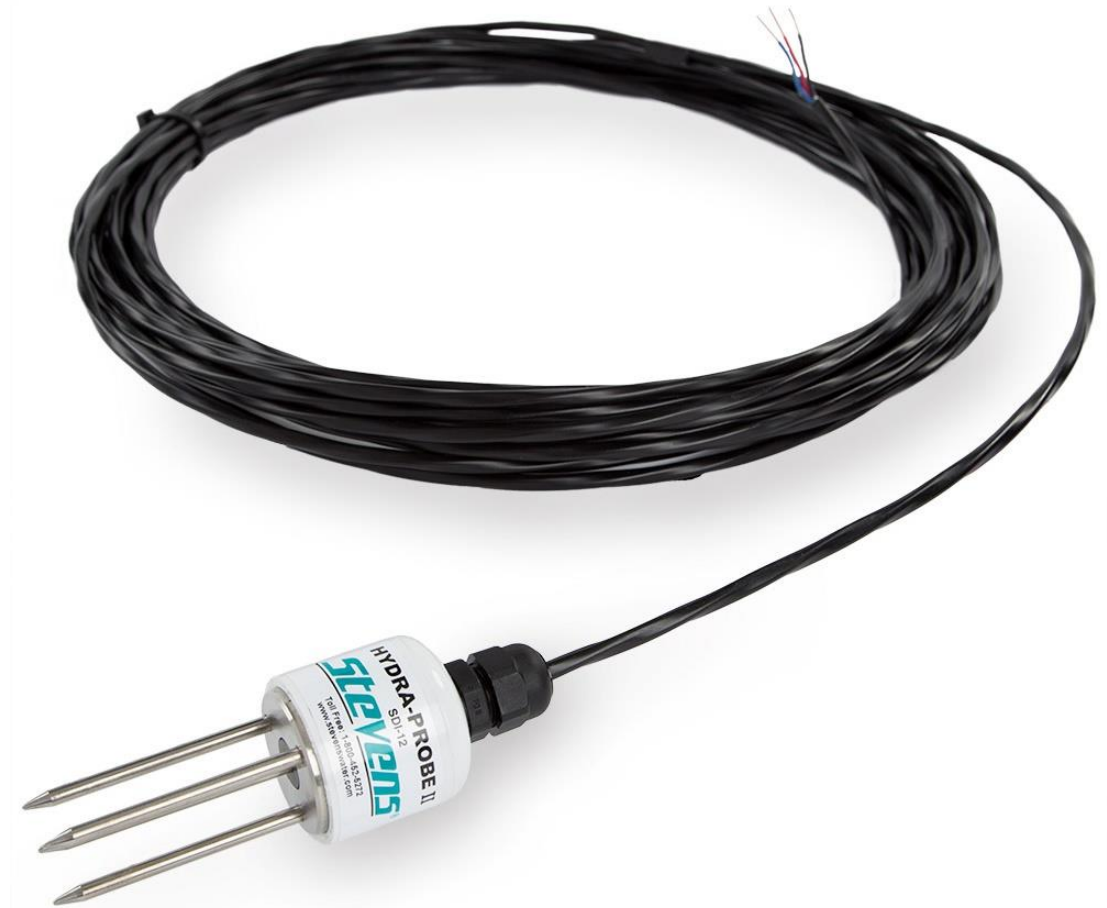


Seasonal relationships between Soil Temperature and Ecosystem Respiration

Soil moisture sensors

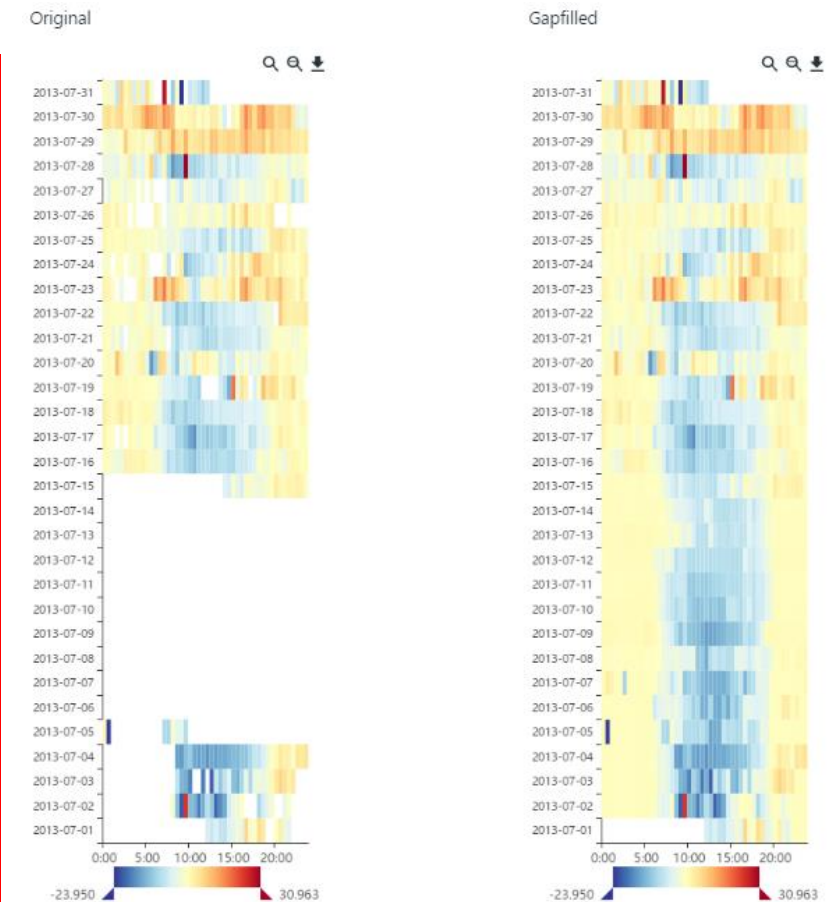
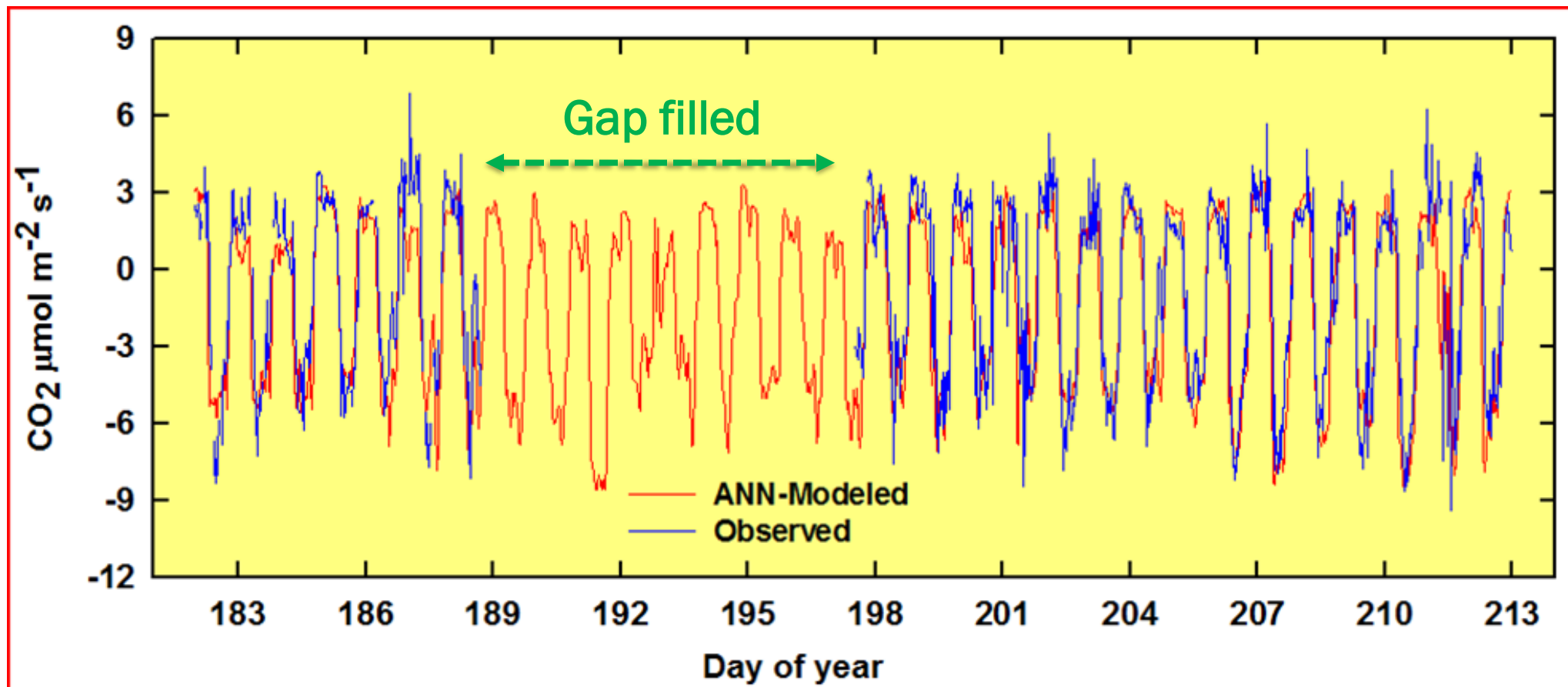
Steven's Hydra Probe II

- Soil Moisture
- Soil Temperature
- Soil Conductivity
- Salinity



Example, large gap (days) in fluxes filled using Biomet variables

- CO_2 Flux modeled using PAR
- *Respiration* modeled using T_s



Biomet used for Partitioning...

Variable for Night-time Partition

FCO2

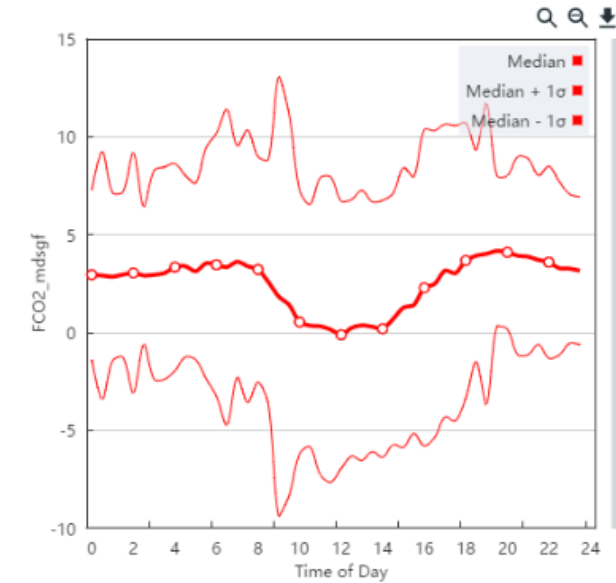
Night-time Partition Inputs

Solar Radiation W/m² SW_IN_1_1_1

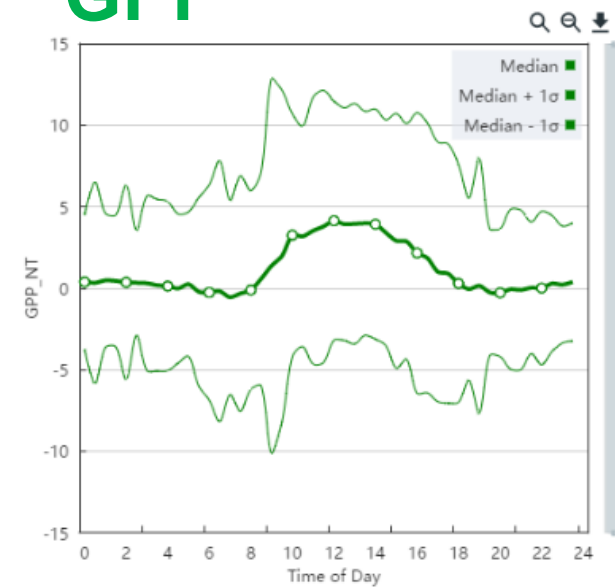
Temperature C TA_1_1_1

VPD Pa VPD

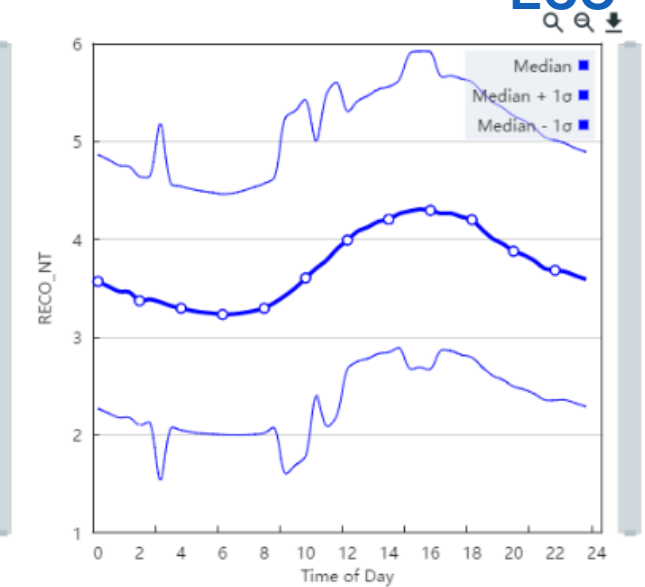
NEE



GPP



RECO



Why collect Biomet measurements?

- Quality Assurance and Quality Checking (QA/QC)
 - Energy Balance closure.
- Recording weather helps to explain site behavior
 - The physical environment has profound effects on the biology as well as on the surface-atmosphere exchange.
- For Data Analysis
 - Gap filling – When instrumentation or power fails.
 - Partitioning – separating NEE into GPP and R_{ECO}
- Improving Fluxes

GHG Software Integration

- Some Biomet variables can improve flux estimates
 - Measured T_{AIR} , RH, and P can replace the mean calculated variables (for example, T_{SONIC})
 - Global radiation and long-wave incoming radiation can be used for off-season uptake correction
 - PAR can be used to assess day/night radiation load on the $\text{CO}_2/\text{H}_2\text{O}$ analyzer

Improving fluxes

Fluxes (e.g. over 30 min intervals) are calculated and corrected based on:

- **Covariances:** calculated from fast measurement, acquired at frequencies > 5 Hz
- **Mean quantities:** averaged over the 30 min interval, calculated starting either from fast or slow measurements

$$F = \overline{\rho_a} \cdot \overline{w'c'}$$

Improving fluxes

Average T_a and P are involved in various flux equations, for example:

- Dry air density:
$$\rho_d = \frac{P}{R_d T_a} - \rho_w \frac{m_d}{m_w}$$
- Gas flux:
$$F = \overline{\rho_d w' s'}$$
- WPL term:
$$F = F_o + \mu \frac{E}{\rho_d} \frac{\rho_c}{1 + \mu \frac{\rho_w}{\rho_d}} + \frac{H}{\rho_a C_p} \frac{\rho_c}{T_a} + P_{term}$$

Improving fluxes

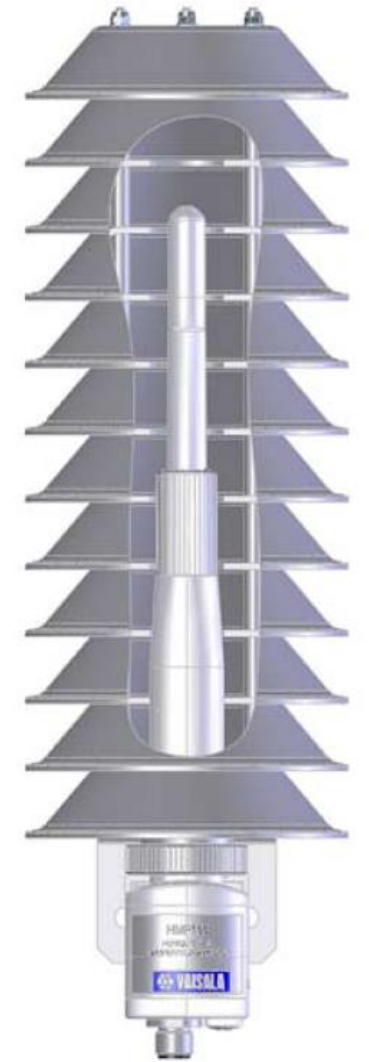
- Global (R_g), longwave incoming (R_l) radiations or PAR are needed in the off-season uptake correction of the LI-7500(A), Burba et al. 2008:

| Parameters for multiple regression* between $T_s - T_a$ and T_a, R_g, R_l, U | | | | | |
|--|--------|--------------------------|--------------------------|--------------------------|------------------------|
| | Offset | Parameter 1 (for T_a) | Parameter 2 (for R_g) | Parameter 3 (for R_l) | Parameter 4 (for U) |
| Daytime | | | | | |
| $T_s^{bot} - T_a$ | 2.8 | -0.0681 | 0.0021 | - | -0.334 |
| $T_s^{top} - T_a$ | -0.1 | -0.0044 | 0.0011 | - | -0.022 |
| $T_s^{spar} - T_a$ | 0.3 | -0.0007 | 0.0006 | - | -0.044 |
| Night-time | | | | | |
| $T_s^{bot} - T_a$ | 0.5 | -0.1160 | - | 0.0087 | -0.206 |
| $T_s^{top} - T_a$ | -1.7 | -0.0160 | - | 0.0051 | -0.029 |
| $T_s^{spar} - T_a$ | -2.1 | -0.0200 | - | 0.0070 | 0.026 |

*Multiple regression: daytime $T_s - T_a = \text{offset} + \text{parameter 1} \times T_a + \text{parameter 2} \times R_g + \text{parameter 4} \times U$; night-time $T_s - T_a = \text{offset} + \text{parameter 1} \times T_a + \text{parameter 3} \times R_l + \text{parameter 4} \times U$. All temperatures are in °C.

Improving fluxes

Humidity and Temperature Probe
Vaisala HMP155 with RM Young Radiation Shield



Thank You

Questions?

