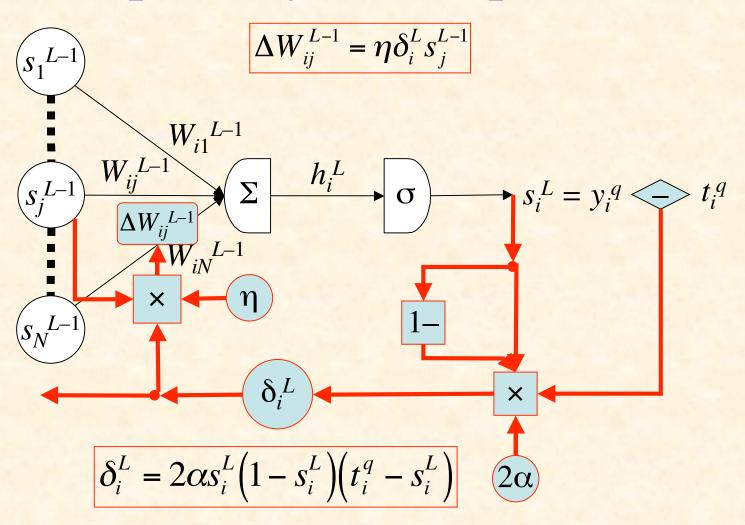
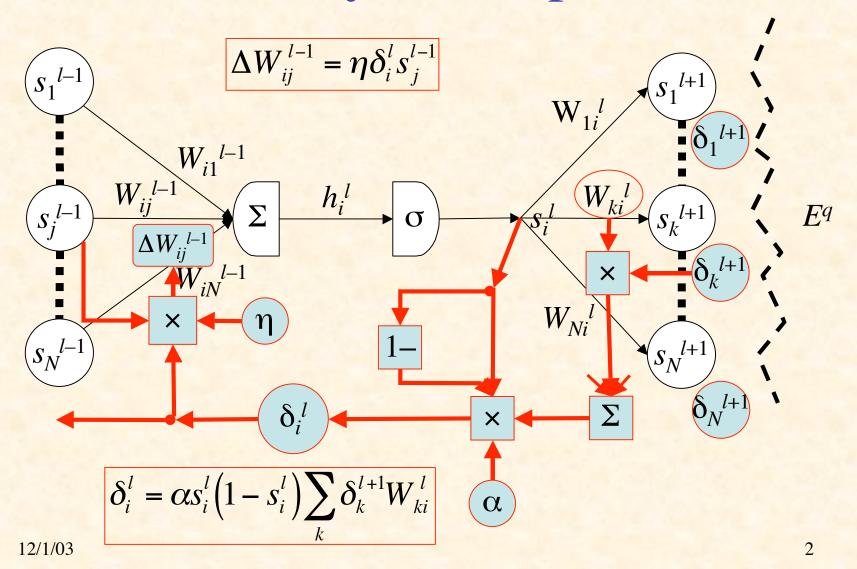
## Output-Layer Computation



#### Hidden-Layer Computation



### Training Procedures

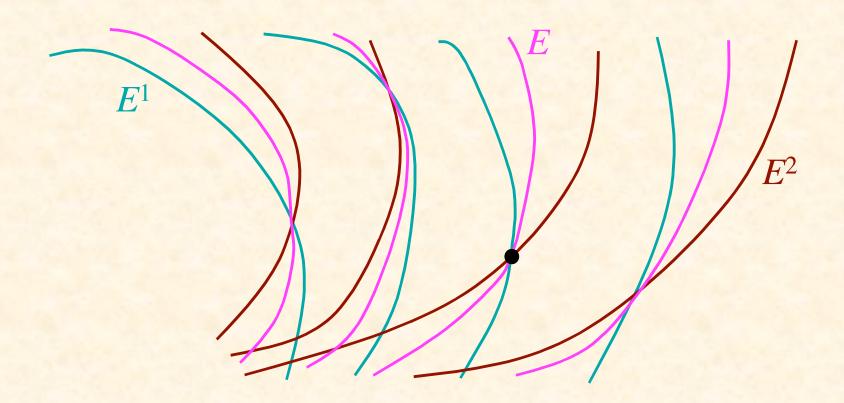
#### Batch Learning

- on each epoch (pass through all the training pairs),
- weight changes for all patterns accumulated
- weight matrices updated at end of epoch
- accurate computation of gradient

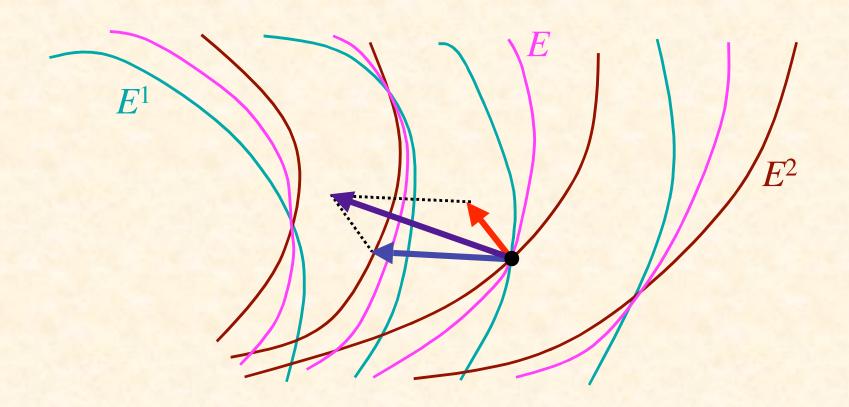
#### Online Learning

- weight are updated after back-prop of each training pair
- usually randomize order for each epoch
- approximation of gradient
- Doesn't make much difference

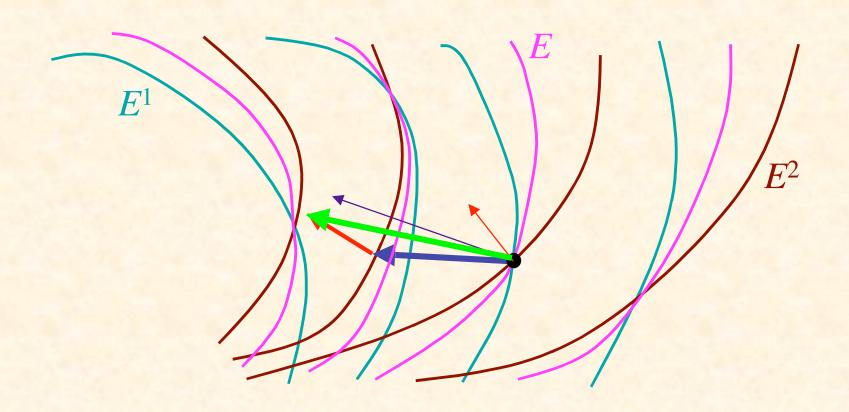
#### Summation of Error Surfaces



# Gradient Computation in Batch Learning



# Gradient Computation in Online Learning



## VIII. Review of Key Concepts

## Complex Systems

- Many interacting elements
- Local vs. global order: entropy
- Scale (space, time)
- Phase space
- Difficult to understand
- Open systems

### Many Interacting Elements

- Massively parallel
- Distributed information storage & processing
- Diversity
  - avoids premature convergence
  - avoids inflexibility

### Complementary Interactions

- Positive feedback / negative feedback
- Amplification / stabilization
- Activation / inhibition
- Cooperation / competition
- Positive / negative correlation

#### Emergence & Self-Organization

- Microdecisions lead to macrobehavior
- Circular causality (macro / micro feedback)
- Coevolution
  - predator/prey, Red Queen effect
  - gene/culture, niche construction, Baldwin effect

#### Pattern Formation

- Excitable media
- Amplification of random fluctuations
- Symmetry breaking
- Specific difference vs. generic identity
- Automatically adaptive

## Stigmergy

- Continuous (quantitative)
- Discrete (qualitative)
- Coordinated algorithm
  - non-conflicting
  - sequentially linked

#### **Emergent Control**

- Stigmergy
- Entrainment (distributed synchronization)
- Coordinated movement
  - through attraction, repulsion, local alignment
  - in concrete or abstract space
- Cooperative strategies
  - nice & forgiving, but reciprocal
  - evolutionarily stable strategy

#### Attractors

- Classes
  - point attractor
  - cyclic attractor
  - chaotic attractor
- Basin of attraction
- Imprinted patterns as attractors
  - pattern restoration, completion, generalization, association

#### Wolfram's Classes

- Class I: point
- Class II: cyclic
- Class III: chaotic
- Class IV: complex (edge of chaos)
  - persistent state maintenance
  - bounded cyclic activity
  - global coordination of control & information
  - order for free

#### Energy / Fitness Surface

- Descent on energy surface / ascent on fitness surface
- Lyapunov theorem to prove asymptotic stability / convergence
- Soft constraint satisfaction / relaxation
- Gradient (steepest) ascent / descent
- Adaptation & credit assignment

#### **Biased Randomness**

- Exploration vs. exploitation
- Blind variation & selective retention
- Innovation vs. incremental improvement
- Pseudo-temperature
- Diffusion
- Mixed strategies

### Natural Computation

- Tolerance to noise, error, faults, damage
- Generality of response
- Flexible response to novelty
- Adaptability
- Real-time response
- Optimality is secondary

### Student Course Evaluation