In [1]:

```
import numpy as np
import matplotlib.pyplot as plt
import scipy.optimize as opt
% matplotlib inline
```

In [2]:

```
# Define the free energies
L Ni = 2310*8.42
                                                                             # J/mol
L_Cu = 1728*6.42
                                                                            # J/mol
R = 8.314
                                                                           # J/mol
V Ni = 8.42
                                                                           # cm^3
V Cu = 6.42
                                                                            # cm^3
V L = 7.42
                                                                            # cm^3
T Ni = 1453+273
                                                                             # K
                                                                             # K
T_Cu = 1085+273
# Definitions (Free energies)
def G_s(X,T):
                return (1-X)*L_Ni*(T-T_Ni)/T_Ni + X*L_Cu*(T-T_Cu)/T_Cu + R*T*((1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log(1-X)*np.log
-X) + X*np.log(X)
def G_l(X,T):
               return R*T*((1-X)*np.log(1-X) + X*np.log(X))
G s = np.vectorize(G s)
G l = np.vectorize(G l)
# Molar free energies for pure components
def G_Ni_s(T):
               return L_Ni*(T-T_Ni)/T_Ni
def G_Cu_s(T):
               return L_Cu*(T-T_Cu)/T_Cu
# diffs
def Gp_s(X,T):
               return -G_Ni_s(T) + G_Cu_s(T) + R*T*(np.log(X)-np.log(1-X))
def Gp_l(X,T):
               return R*T*(np.log(X)-np.log(1-X))
```

```
# Chemical potentials:
def mu_Cu_s(X_Cu_s,T):
    return G_s(X_Cu_s,T) + (1-X_Cu_s)*Gp_s(X_Cu_s,T)

def mu_Ni_s(X_Cu_s,T):
    return G_s(X_Cu_s,T) - X_Cu_s*Gp_s(X_Cu_s,T)

def mu_Cu_l(X_Cu_l,T):
    return G_l(X_Cu_l,T) + (1-X_Cu_l)*Gp_l(X_Cu_l,T)

def mu_Ni_l(X_Cu_l,T):
    return G_l(X_Cu_l,T) - X_Cu_l*Gp_l(X_Cu_l,T)
```

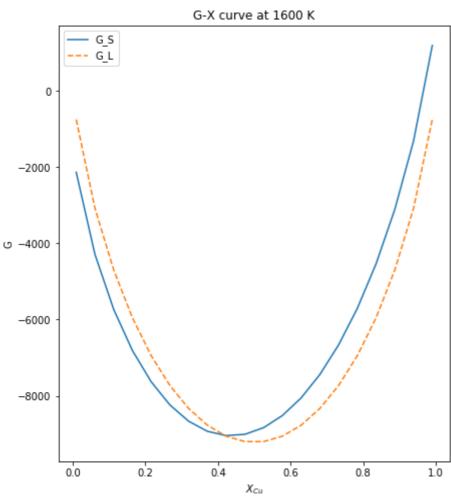
In [3]:

```
sample = np.linspace(0.01,0.99,20)

T=1600

fig,ax = plt.subplots(figsize=(7,8))
ax.set_title('G-X curve at ' + str(T) + ' K')
ax.plot(sample, G_s(sample,T),label='G_S')
ax.plot(sample, G_l(sample,T),linestyle='dashed',label='G_L')
ax.set_xlabel('$X_{Cu}$')
ax.set_ylabel('G')
ax.legend()

plt.show()
```



```
In [20]:
# Solving for equilibrium conditions
number = 371
temp range = np.linspace(1360,1730,number)
solutions = np.zeros([number,3])
def equations(X Cu,T):
    X s, X l = X Cu
    fun1 = G Ni s(T) + R*T*np.log(1-X s) - R*T*np.log(1-X l)
    fun2 = G Cu s(T) + R*T*np.log(X s) - R*T*np.log(X l)
    return fun1, fun2
for i in range(number):
    x s, x l = opt.fsolve(equations, [0.4,0.6], temp range[i])
    solutions[i] = [temp range[i],x s,x l]
solved = solutions[solutions[:,1] != 0.4]
/home/rohith/installations/anaconda3/lib/python3.6/site-packages/ipy
kernel launcher.py:13: RuntimeWarning: invalid value encountered in
 del sys.path[0]
/home/rohith/installations/anaconda3/lib/python3.6/site-packages/ipy
kernel launcher.py:14: RuntimeWarning: invalid value encountered in
log
/home/rohith/installations/anaconda3/lib/python3.6/site-packages/sci
py/optimize/minpack.py:163: RuntimeWarning: The iteration is not mak
ing good progress, as measured by the
```

improvement from the last ten iterations.

warnings.warn(msg, RuntimeWarning)

/home/rohith/installations/anaconda3/lib/python3.6/site-packages/sci py/optimize/minpack.py:163: RuntimeWarning: The iteration is not mak ing good progress, as measured by the

improvement from the last five Jacobian evaluations. warnings.warn(msg, RuntimeWarning)

In [21]:

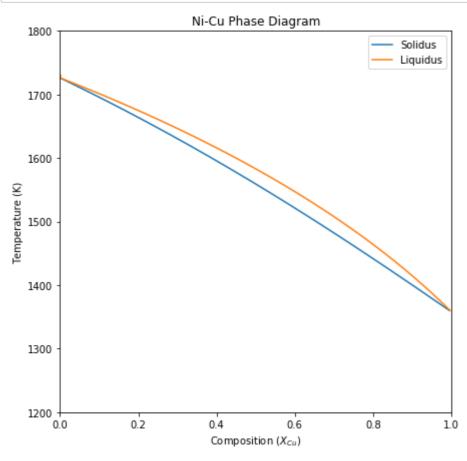
```
solved.shape
```

Out[21]:

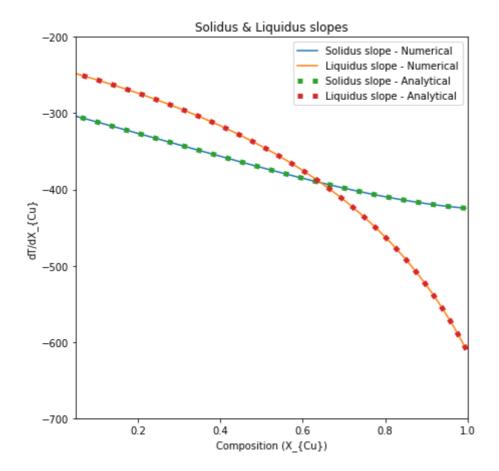
(371, 3)

In [22]:

```
fig, ax = plt.subplots(figsize = (7,7))
ax.set_ylabel('Temperature (K)')
ax.set_xlabel('Composition ($X_{Cu}$)')
ax.set_xlim(0,1)
ax.set_ylim(1200,1800)
ax.set_title('Ni-Cu Phase Diagram')
ax.plot(solved[:,1],solved[:,0], label='Solidus')
ax.plot(solved[:,2],solved[:,0], label='Liquidus')
ax.legend()
fig.savefig('Phase_diagram')
```



```
# computing slopes of liquidus and solidus
# And also comparing with analytical solution:
solidus diff = np.gradient(solved[:,0],solved[:,1]) # numerical solution
liquidus diff = np.gradient(solved[:,0],solved[:,2]) # numerical solution
# Analytical solutions
def solidus slope(T,X s,X l):
    return R*T*T*((X s - X l)/(X s*(1-X s)*((1-X l)*L Ni + X l*L Cu)))
def liquidus slope(T,X s,X l):
    return R*T*T*((X s - X l)/(X l*(1-X l)*((1-X s)*L Ni + X s*L Cu)))
solid slopes = [solidus slope(solved[i,0],solved[i,1],solved[i,2]) for i in rang
e(solved.shape[0])]
liquid slopes = [liquidus slope(solved[i,0],solved[i,1],solved[i,2]) for i in ra
nge(solved.shape[0])]
# Plotting
fig, ax = plt.subplots(figsize = (7,7))
ax.set ylabel('dT/dX {Cu}')
ax.set xlabel('Composition (X {Cu})')
ax.set xlim(0.05,1)
ax.set ylim(-700, -200)
ax.set title('Solidus & Liquidus slopes')
ax.plot(solved[:,1],solidus diff, label='Solidus slope - Numerical')
ax.plot(solved[:,2],liquidus diff, label='Liquidus slope - Numerical')
ax.plot(solved[:,1],solid slopes, label='Solidus slope - Analytical', linestyle=
(0,(1,2)), linewidth=5)
ax.plot(solved[:,2],liquid slopes, label='Liquidus slope - Analytical', linestyl
e=(0,(1,2)), linewidth=5)
ax.legend()
fig.savefig('Soliquidus slope')
```



```
# Finding Driving force values (for given undercooling dT)
def driv_equation(X_Cu_s, X_Cu_l, T, dT):
    return mu Ni l(X Cu l, T-dT) - mu Ni s(X Cu s, T-dT) - (mu Cu l(X Cu l, T-dT)
 - mu Cu s(X Cu s,T-dT))*V Ni/V Cu
# Solving for X Cu s (At specific undercooling)
\# Solns are in the form [X_Cu_s,X_Cu_l,T]. X_Cu_s is equilibrium composition at
given undercooling
solns 1K = np.array([np.array([opt.fsolve(driv equation, 0.2, (solved[i,2], solv
ed[i,0], 1))[0],solved[i,2],solved[i,0]]) for i in range(solved.shape[0])])
solns 1K = solns 1K[solns 1K[:,0] !=0.2]
solns_10K = np.array([np.array([opt.fsolve(driv_equation, 0.2, (solved[i,2], sol
ved[i,0], 10))[0],solved[i,2],solved[i,0]]) for i in range(solved.shape[0])])
solns 10K = solns \ 10K[solns \ 10K[:,0] \ !=0.2]
solns 01K = np.array([np.array([opt.fsolve(driv equation, 0.2, (solved[i,2], sol
ved[i,0], 0.1))[0],solved[i,2],solved[i,0]]) for i in range(solved.shape[0])])
solns 01K = solns \ 01K[solns \ 01K[:,0]!=0.2]
/home/rohith/installations/anaconda3/lib/python3.6/site-packages/ipy
kernel launcher.py:19: RuntimeWarning: invalid value encountered in
/home/rohith/installations/anaconda3/lib/python3.6/site-packages/ipy
```

kernel launcher.py:43: RuntimeWarning: invalid value encountered in /home/rohith/installations/anaconda3/lib/python3.6/site-packages/sci

py/optimize/minpack.py:163: RuntimeWarning: The iteration is not mak ing good progress, as measured by the

improvement from the last ten iterations.

warnings.warn(msg, RuntimeWarning)

In [81]:

```
# Compute driving forces. Values are in J/cm^3
def calc deltaP(X Cu s,X Cu l,T):
    delta_P = (mu_Cu_l(X_Cu_l,T) - mu_Cu_s(X_Cu_s,T))/V_Cu
    return delta P
delta P 1K = np.array([calc deltaP(solns <math>1K[i,0],solns 1K[i,1],solns 1K[i,2]-1)
for i in range(solns 1K.shape[0])])
delta_P_10K = np.array([calc_deltaP(solns_10K[i,0],solns_10K[i,1],solns_10K[i,2])
-100) for i in range(solns 10K.shape[0])])
delta_P_01K = np.array([calc_deltaP(solns_01K[i,0],solns_01K[i,1],solns_01K[i,2]
-0.001) for i in range(solns 01K.shape[0]))
```

```
# Compute appx. driving force

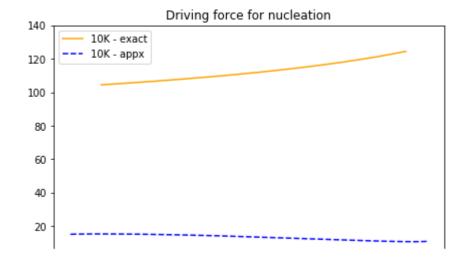
def calc_deltaP_appx(X_Cu_s,X_Cu_l,T,dT):
    mu_eq = mu_Ni_s(1-X_Cu_s,T) - mu_Cu_s(X_Cu_s,T)
    mu_dT = mu_Ni_s(1-X_Cu_s,T-dT) - mu_Cu_s(X_Cu_s,T-dT)

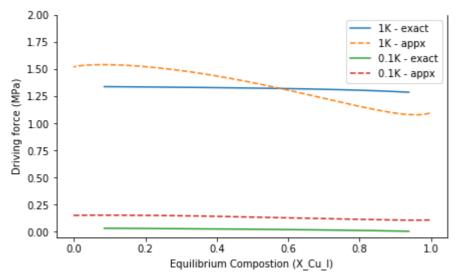
    S_s = L_Ni*(1-X_Cu_s)/T_Ni + L_Cu*X_Cu_s/T_Cu + R*(X_Cu_s*np.log(X_Cu_s)+(1-X_Cu_s)*np.log(1-X_Cu_s))
    S_l = R*(X_Cu_l*np.log(X_Cu_l)+(1-X_Cu_l)*np.log(1-X_Cu_l))
    appx_delta_P = ((X_Cu_s - X_Cu_l)*(mu_dT - mu_eq) + (S_s - S_l)*dT)/V_L
    return appx_delta_P

appx_delta_P_1K = np.array([calc_deltaP_appx(solved[i,1],solved[i,2],solved[i,0],0.1) for i in range(solved.shape[0])])
appx_delta_P_01K = np.array([calc_deltaP_appx(solved[i,1],solved[i,2],solved[i,0],0.1) for i in range(solved.shape[0])])
appx_delta_P_10K = np.array([calc_deltaP_appx(solved[i,1],solved[i,2],solved[i,0],10) for i in range(solved.shape[0])])
```

In [105]:

```
fig, (ax1,ax2) = plt.subplots(2,1, figsize = (7,9))
ax2.set_ylabel('Driving force (MPa)')
ax2.set xlabel('Equilibrium Compostion (X Cu l)')
ax1.set title('Driving force for nucleation')
ax2.plot(solns_1K[30:,1],delta_P_1K[30:], label='1K - exact')
ax2.plot(solved[:,2],appx_delta_P_1K, label='1K - appx',linestyle='--')
ax2.plot(solns 01K[30:,1],delta P 01K[30:], label='0.1K - exact')
ax2.plot(solved[:,2],appx_delta_P_01K, label='0.1K - appx',linestyle='--')
ax2.set ylim(-0.05,2)
ax1.plot(solns 1K[30:,1],delta P 10K[30:], label='10K - exact', c='orange')
ax1.plot(solved[:,2],appx delta P 10K, label='10K - appx', c='blue',linestyle='-
ax1.set ylim(7,140)
ax1.tick params(
    axis='x',
                       # changes apply to the x-axis
   which='both',
                       # both major and minor ticks are affected
    bottom=False,
                       # ticks along the bottom edge are off
    top=False,
                       # ticks along the top edge are off
    labelbottom=False) #
ax1.spines['bottom'].set visible(False)
ax2.spines['top'].set_visible(False)
ax1.legend()
ax2.legend()
fig.savefig('Driving force')
```





In [115]:

```
# Critical curvature for equilibrium liquid at 1500K, undercooling of 1K
print(solns_1K[136,2],delta_P_1K[136])
crit_curv = delta_P_1K[136]*1000000/0.1*2
print(crit_curv)
radius = 1/crit_curv
print(radius)
```

1500.0 1.310716613410211 26214332.268204223 3.8147071219239705e-08